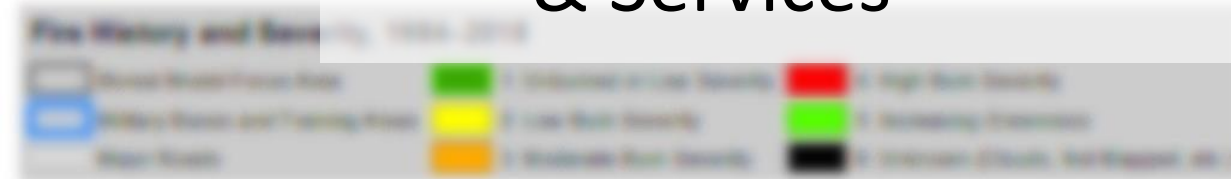


Resiliency and Vulnerability of Boreal Forest Habitat across DoD Lands of Interior Alaska

SERDP Project: RC18-C2-1183

PI Dr. Scott Goetz, NAU

Presenter: Matt Macander,
ABR, Inc.—Environmental Research
& Services



Resiliency and Vulnerability of Boreal Forest Habitat across DoD Lands of Interior Alaska

Project Progress and Results

- *Deep burning shifts forests from spruce to deciduous tree dominance*
- *Climate and insect leaf mining Impacts aspen productivity*
- *Aspen mortality and decreased productivity: drivers and trends*
- *Compiled extensive forest inventory PSP database and early warning signals of tree mortality and biomass change*
- *Advanced mechanistic predictive modeling of forest composition and productivity under climate change scenarios.*

Technology Transition

- *Next steps in the development of the technology and planned outreach efforts to potential end-users is in its nascent stages, but productive meetings have been held and more are scheduled.*

Project Team: Resiliency and Vulnerability of Boreal Forest Habitat across DoD Lands of Interior Alaska

Project Number RC18-C2-1183

Dr. Scott Goetz (PI), Michelle Mack, Adrianna Foster

Northern Arizona University

- Biophysical remote sensing, ecosystem assessment & monitoring
- Arctic and boreal ecology, vegetation succession & post-disturbance recovery
- Ecosystem modeling / individual based tree models

Dr. Brendan Rogers, Stefano Potter, Sol Cooperdock

Woods Hole Research Center

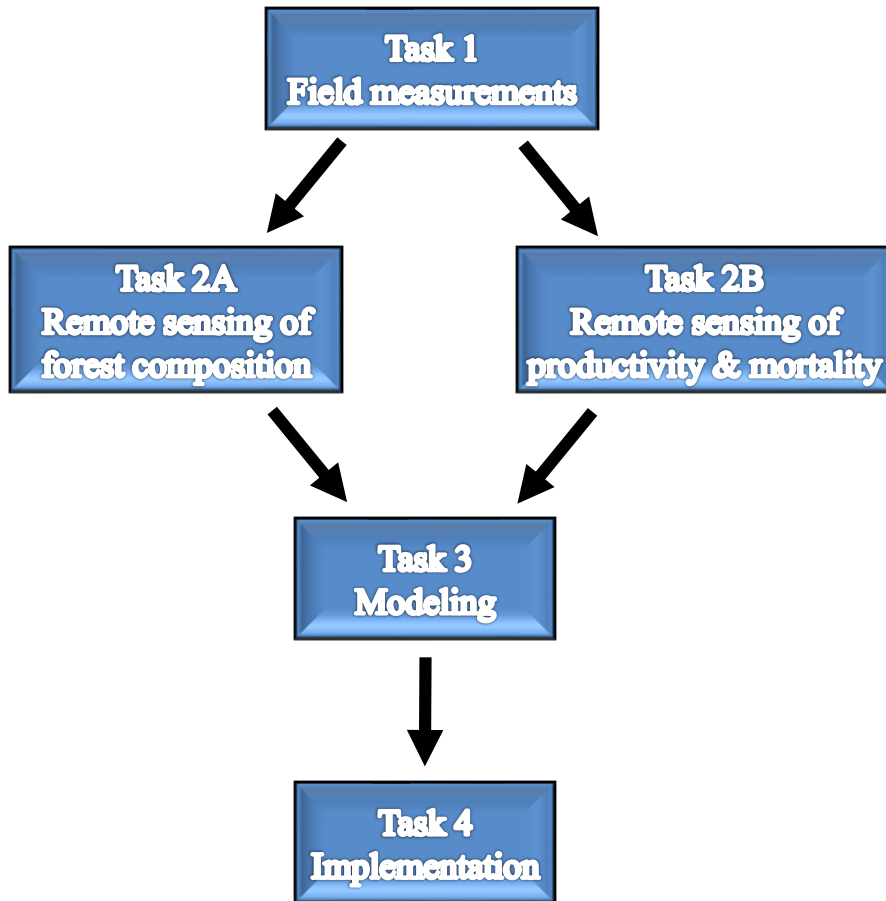
- Remote sensing, vulnerability assessment

Mr. Matt Macander & JJ Frost

ABR, Inc.—Environmental Research & Services

- Vegetation mapping, change detection, geospatial techniques

Technical Approach / Research Objectives



Our technical approach includes 4 primary research tasks, which ultimately flow into implementation.

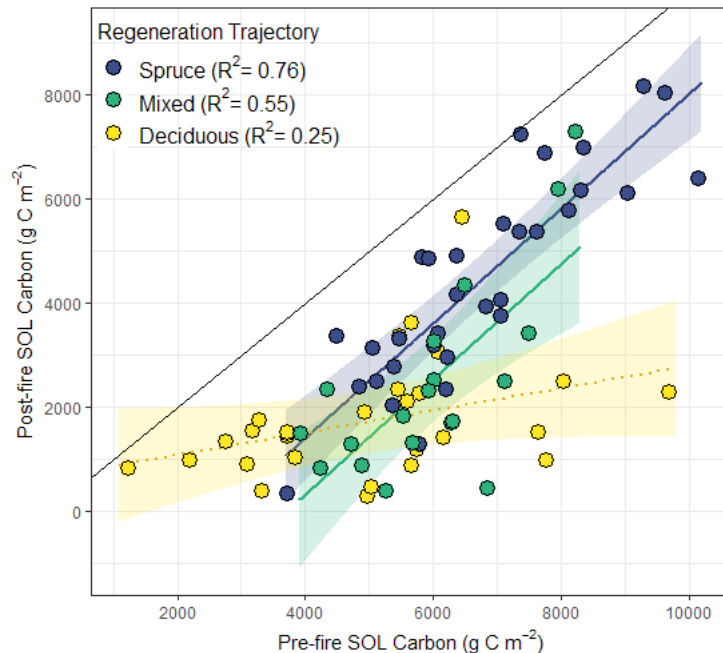
Tasks inform one another

- Field measurements inform remote sensing product development (composition, productivity & mortality).
- Remote sensing products inform the modeling efforts.

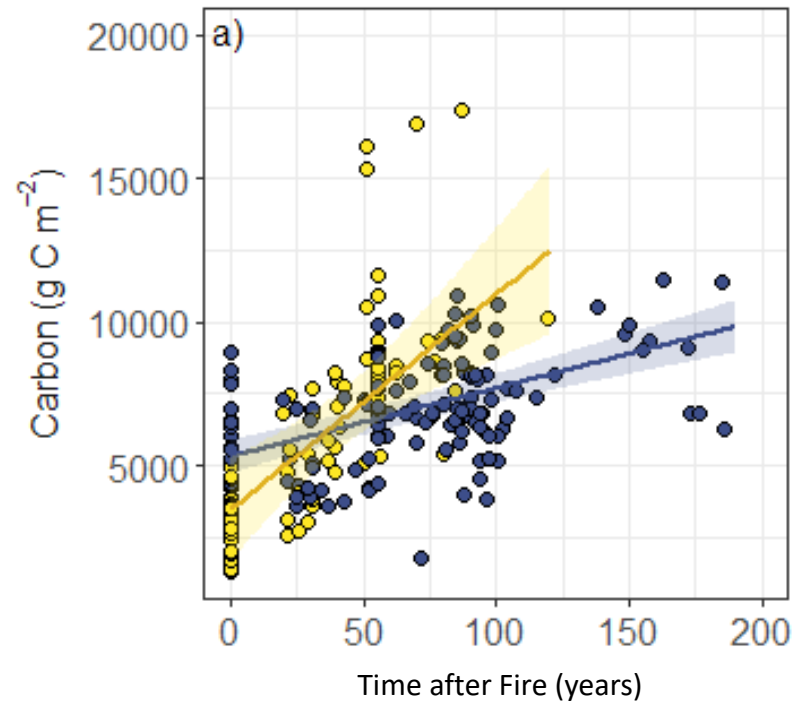
All are relevant to implementation and transitioning outputs & capabilities.

Field Measurement Results

Deep burning shifts forests from spruce to deciduous tree dominance



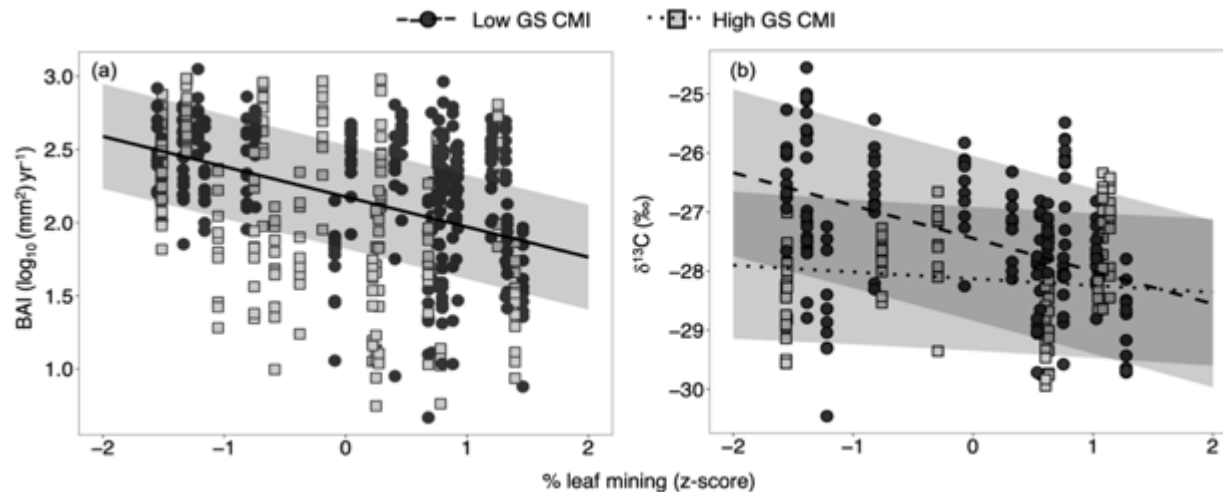
Deep burning of organic soil reduces ecosystem carbon pools and shifts post-fire regeneration to deciduous dominance



Deciduous stands accumulate carbon more rapidly over succession, resulting in a net increase in ecosystem carbon storage despite greater initial combustion losses

Field Measurement Results

Impacts of climate and *Phyllocnistis populiella* leaf mining on aspen productivity and physiology

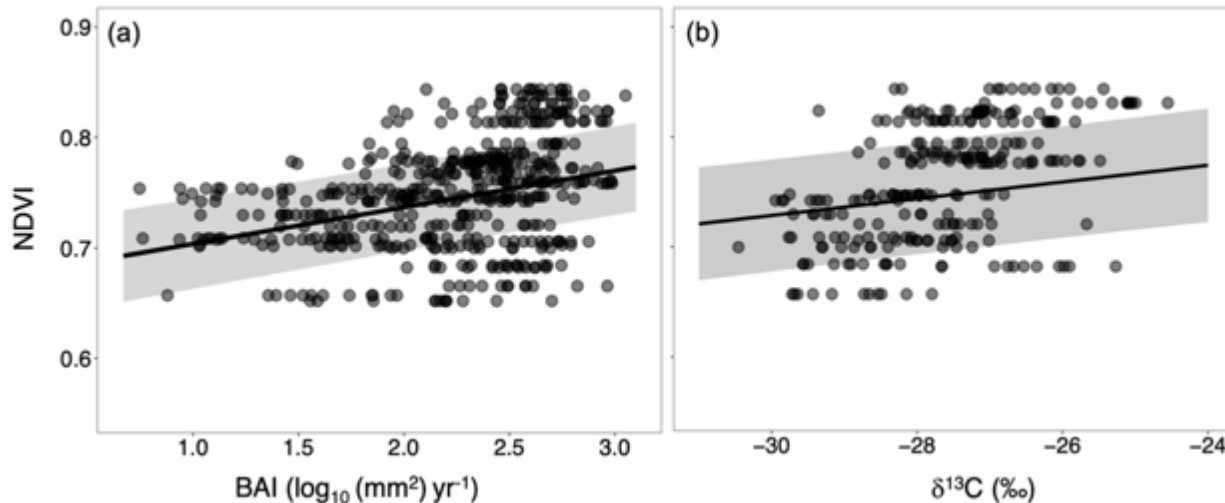


- Productivity (Basal Area Increment) decreased with greater leaf mining, and was not sensitive to growing season moisture
- Climate and leaf mining interacted to influence physiology ($\delta^{13}\text{C}$), with greater mining resulting in decreased $\delta^{13}\text{C}$ when moisture availability was low

Leaf mining has larger impact on aspen productivity and physiology than climate (thus far)

Results

Relationships between summer NDVI and aspen productivity and physiology



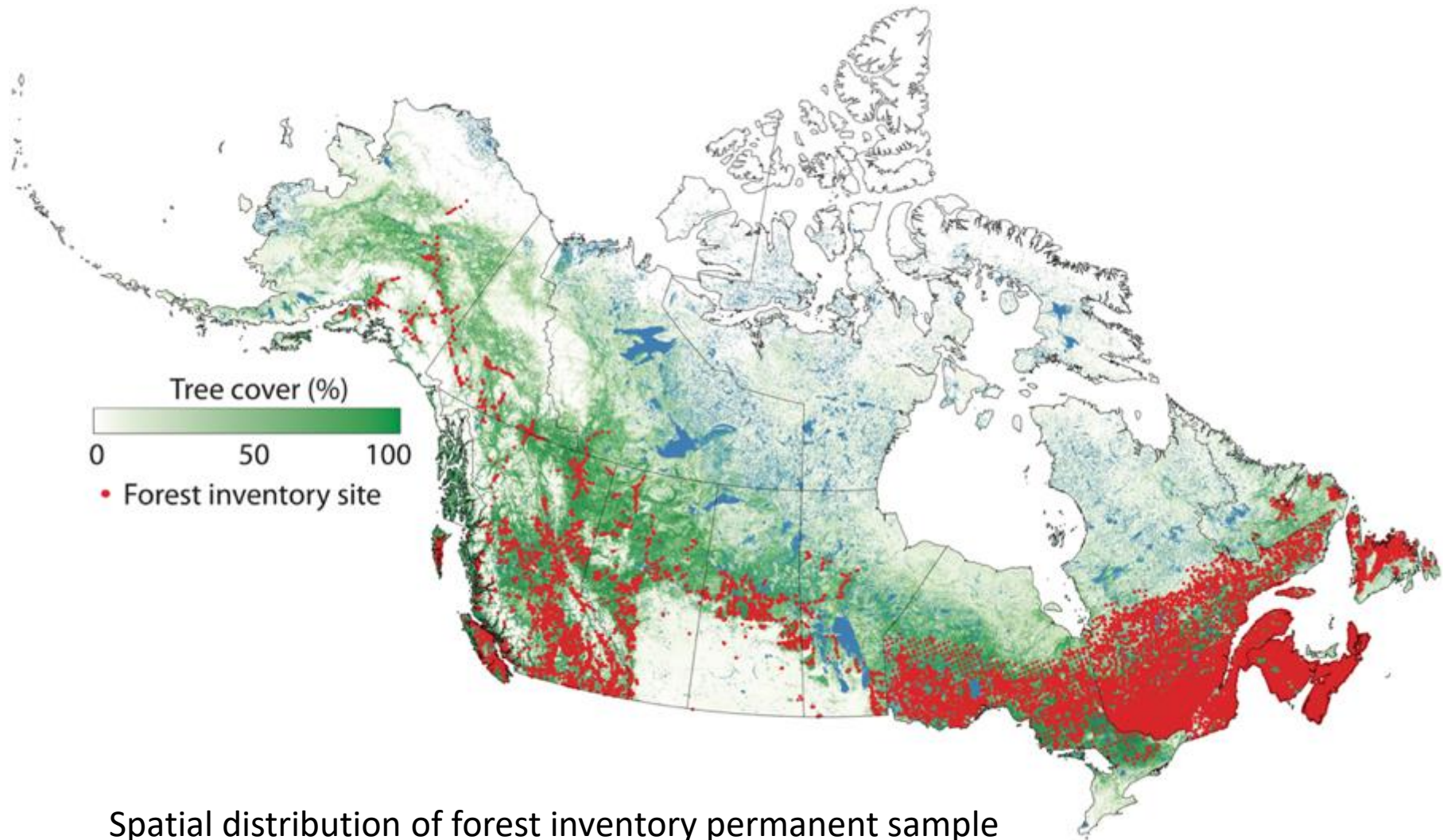
- Mean annual July-August NDVI was positively correlated with BAI and $\delta^{13}\text{C}$, capturing the effects of leaf mining on aspen productivity and physiology

It is essential to account for leaf mining when interpreting satellite vegetation productivity trends in interior Alaska

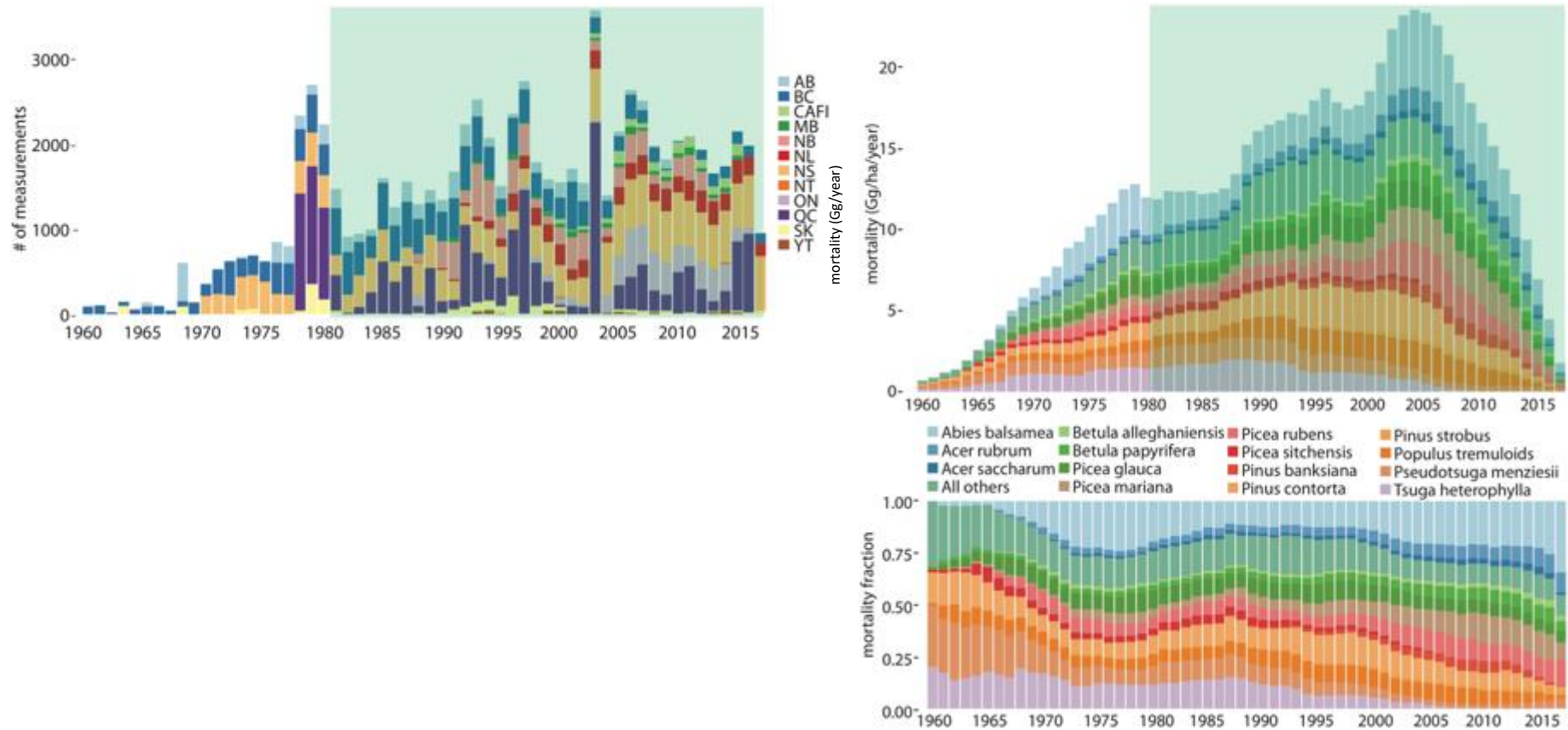
Task 2b: Remote sensing of productivity & mortality

Subtask: Characterization of Early Warning Signals (EWS)

- *Overarching goal:* develop a comprehensive characterization of mortality EWS in western boreal North America.
- Long-term NDVI from Landsat (30 m), MODIS (250 m) and AVHRR (8 km)
- Repeat forest inventories from AK & western Canada
- Apply a variety of EWS metrics to different sensors & inventories
- *Questions*
 1. What combination of EWS metrics, sensors, and mortality calculations are most robust?
 2. How does this vary by region, species, mortality level, canopy density, stand age, landscape position, drought/infestation severity, and inventory specifications?
 3. What is the predictive power of these EWS, and over what timescales?



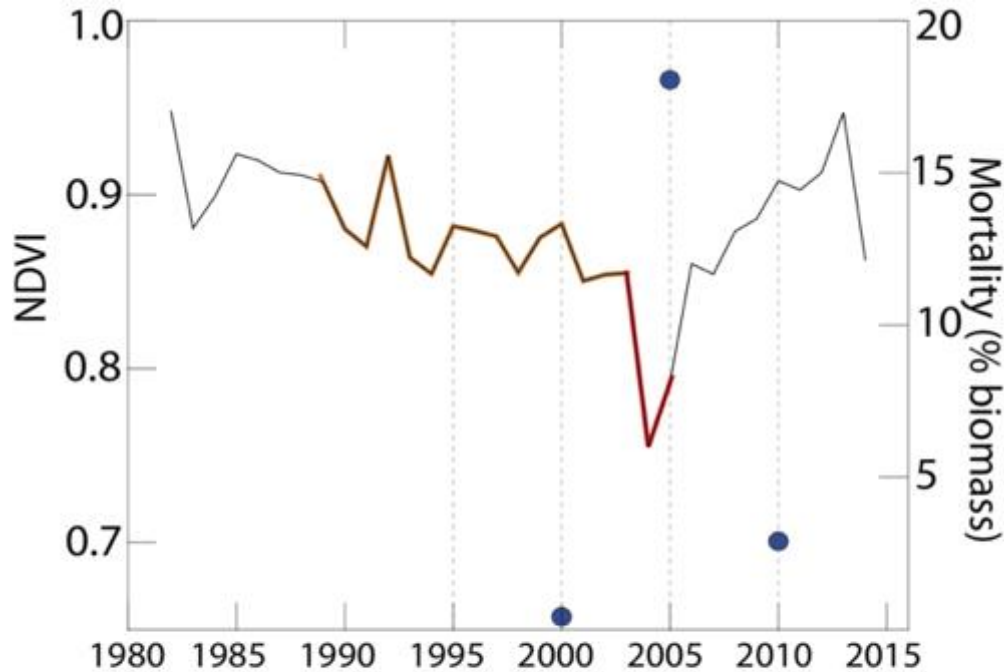
Spatial distribution of forest inventory permanent sample plots (PSPs) across Alaska and Canada. The total number of PSPs is greater than 30,000.



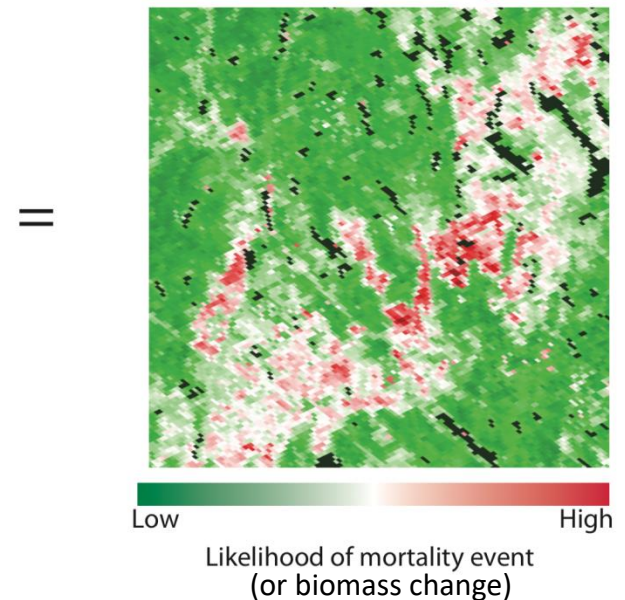
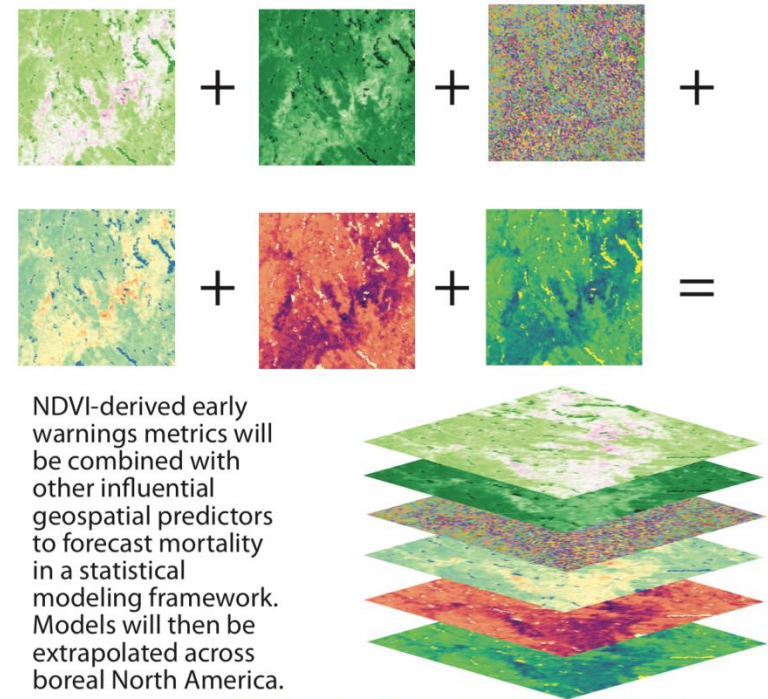
The **top left** panel shows the number of inventory observations each year.

The **right panel** shows the mortality (in both Gg per year and fraction of total) of the 15 most commonly observed tree species.

Green shaded boxes represent the satellite era (~1980 to present).



- Examples of early warning signals of tree mortality that can be detected in satellite NDVI records.
- Above, a PSP's NDVI (line) decreases for 20+ years preceding a high mortality event (point).
- Right, various statistical metric responses to a variable approaching a critical transition (in this case mortality), or general biomass changes.
- These statistical responses can be applied to satellite NDVI trends to predict transitions/changes.



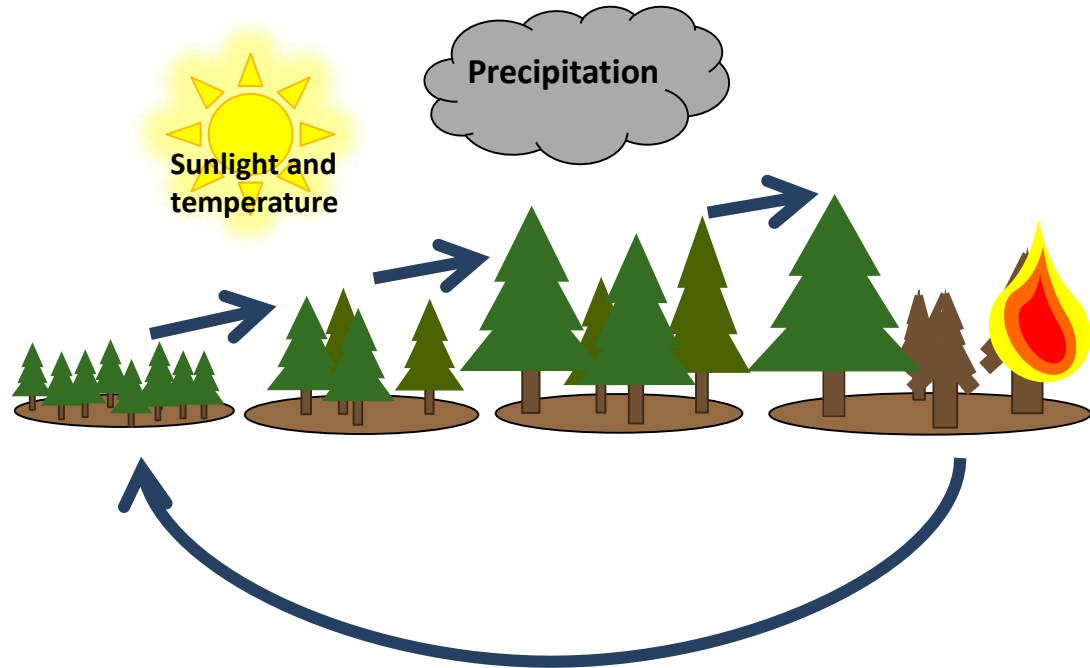
Task 3: Predictive modeling

- Use Tasks 1 & 2 to develop predictive models of forest type, cover, productivity, and mortality for DoD managers and the scientific community
- *Questions:*
 1. What will forest composition and cover of recently burned landscapes look like in 10-50 years?
 2. What areas of the landscape are most vulnerable or resilient to:
 - i. fire-driven shifts in forest composition?
 - ii. declining productivity?
 - iii. drought & pest related mortality?
 3. How do these projected future conditions differ from historic landscapes?

UVAFME – individual tree-based model



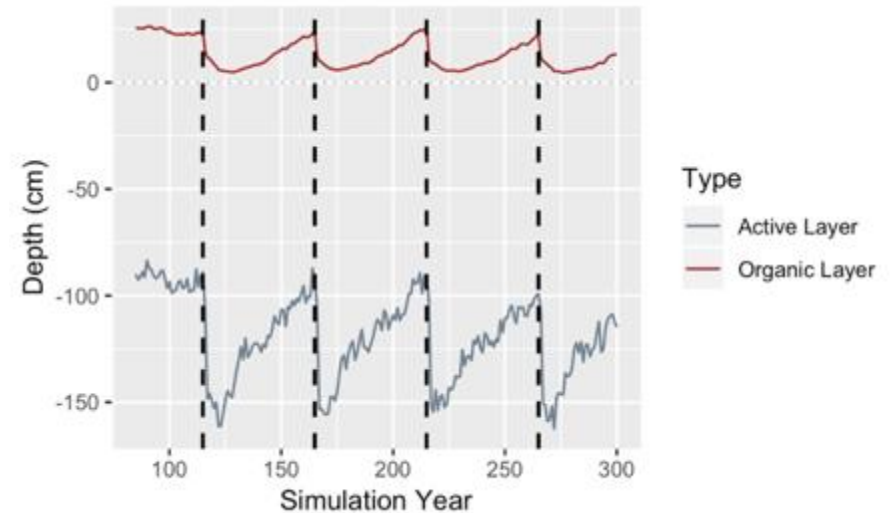
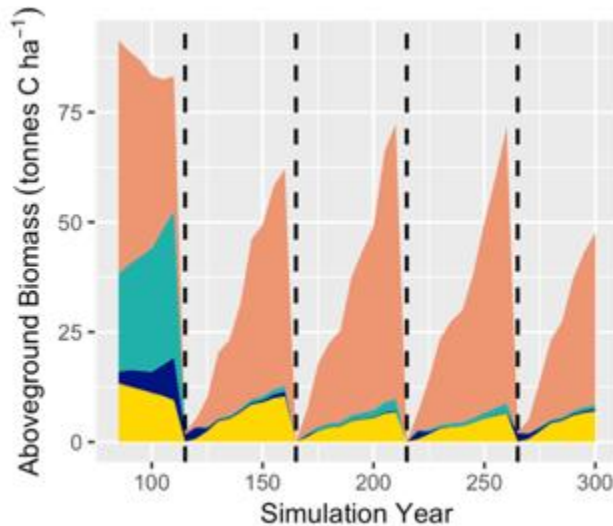
UVAFME



Simulates the regeneration, growth,
and mortality of individual trees on
patches of a forested landscape

UVAFME is able to capture vegetation-fire-soil interactions

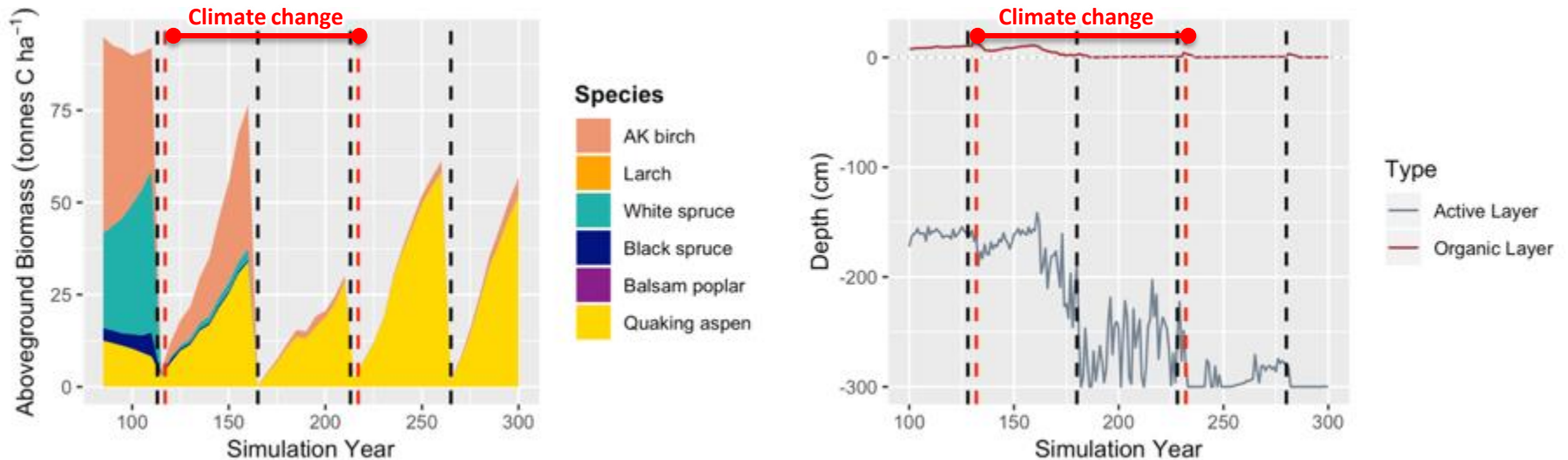
White spruce site - fires recurring every 50 years.



Fire -> canopy opens up, part of the organic layer is consumed
-> Leads to increased active layer depth
As forest regenerates and organic layer develops, active layer decreases.

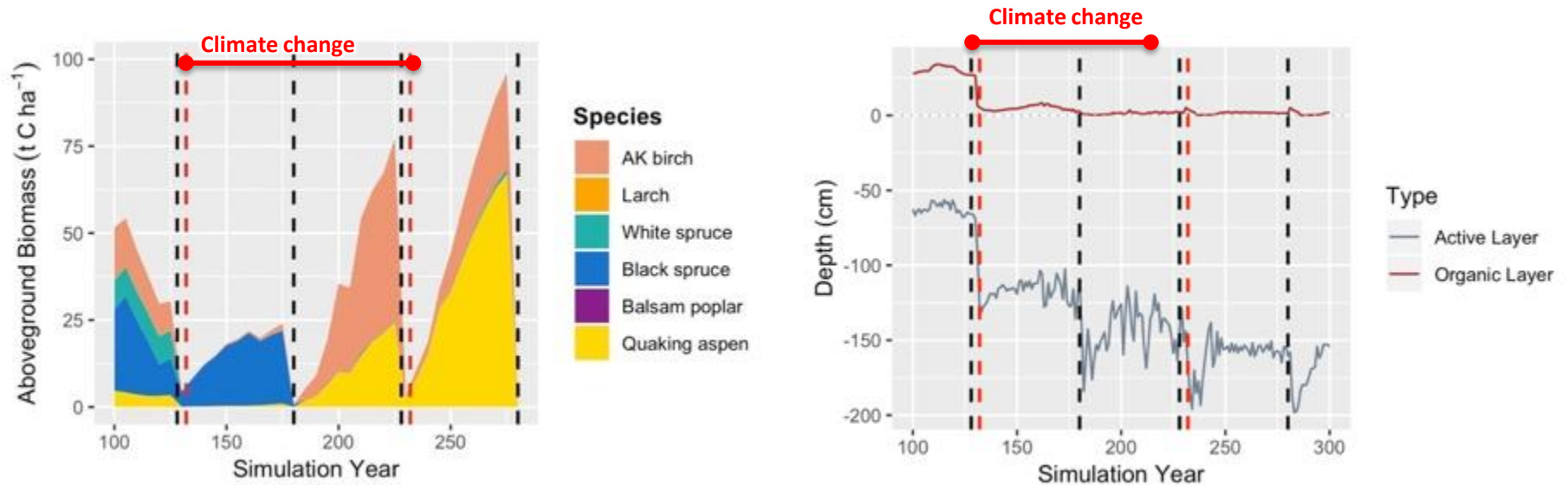
UVAFME is able to capture vegetation-fire-soil interactions

White spruce site - fires recurring every 50 years + concurrent RCP 8.5 climate change



Recurring fires together with climate change, rapidly shift WS site to aspen.
Organic layer decreases and active layer increases significantly.

Black spruce site - fires recurring every 50 years + concurrent RCP 8.5 climate change

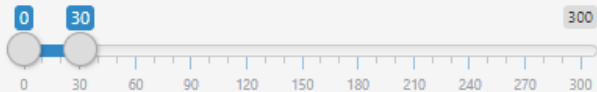


With climate change a 50 year FRI shifts black spruce forest to high productivity aspen stand

UVAFME Shiny App (beta)

Species-level output

Years



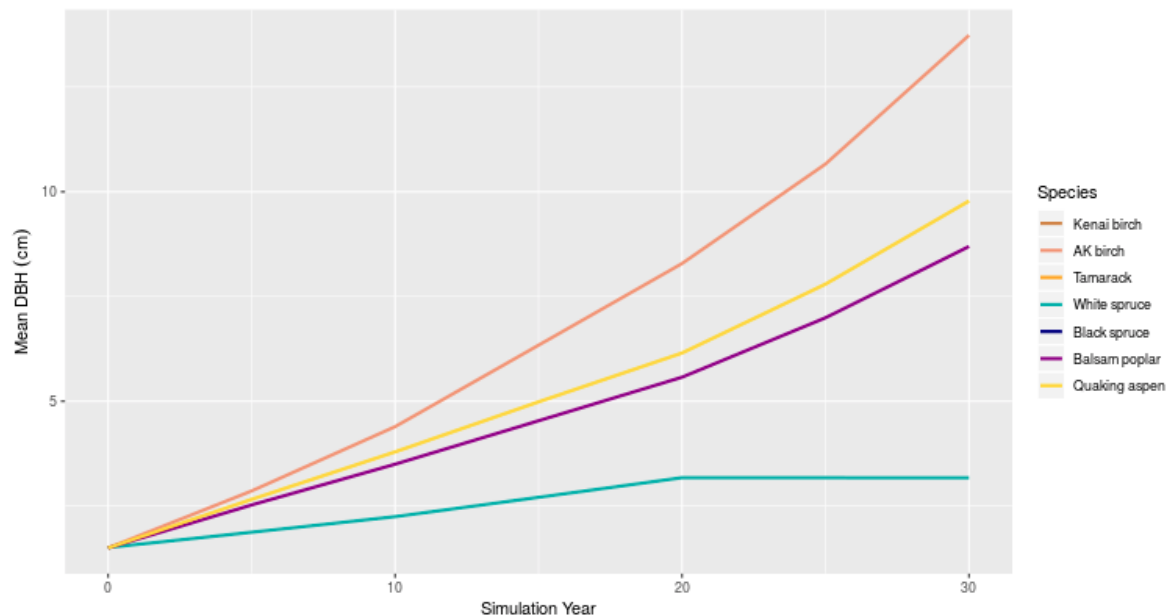
Output variable

- ☐ Biomass
- ☐ Basal area
- ☒ Mean DBH
- ☐ Max height
- ☐ Stem density

site ID

13

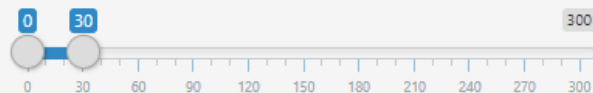
Site 13: well-drained white spruce stand
Site 14: poorly drained black spruce stand
Site 15: dry deciduous stand



UVAFME Shiny App (beta)

Species-level output

Years



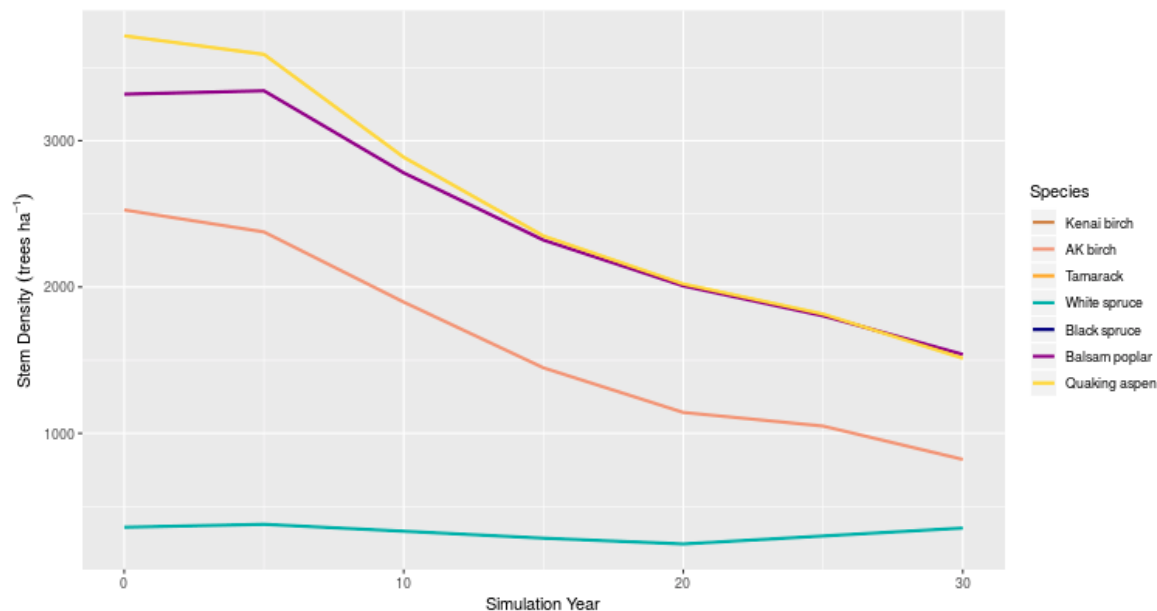
Output variable

- ☐ Biomass
- ☐ Basal area
- ☐ Mean DBH
- ☐ Max height
- ☒ Stem density

site ID

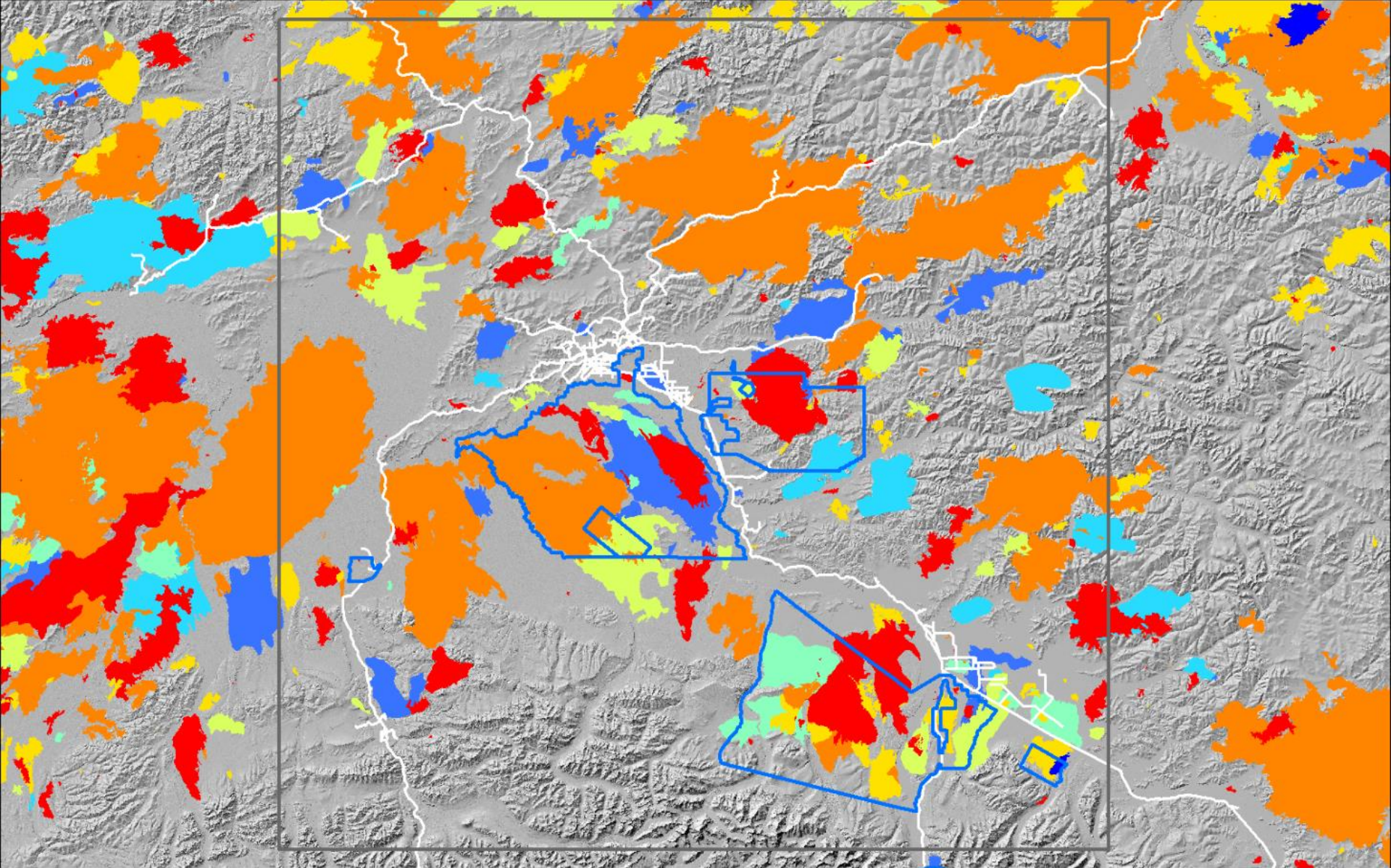
13

Site 13: well-drained white spruce stand
Site 14: poorly drained black spruce stand
Site 15: dry deciduous stand



Task 2a: Remote sensing of canopy composition, density, burn severity

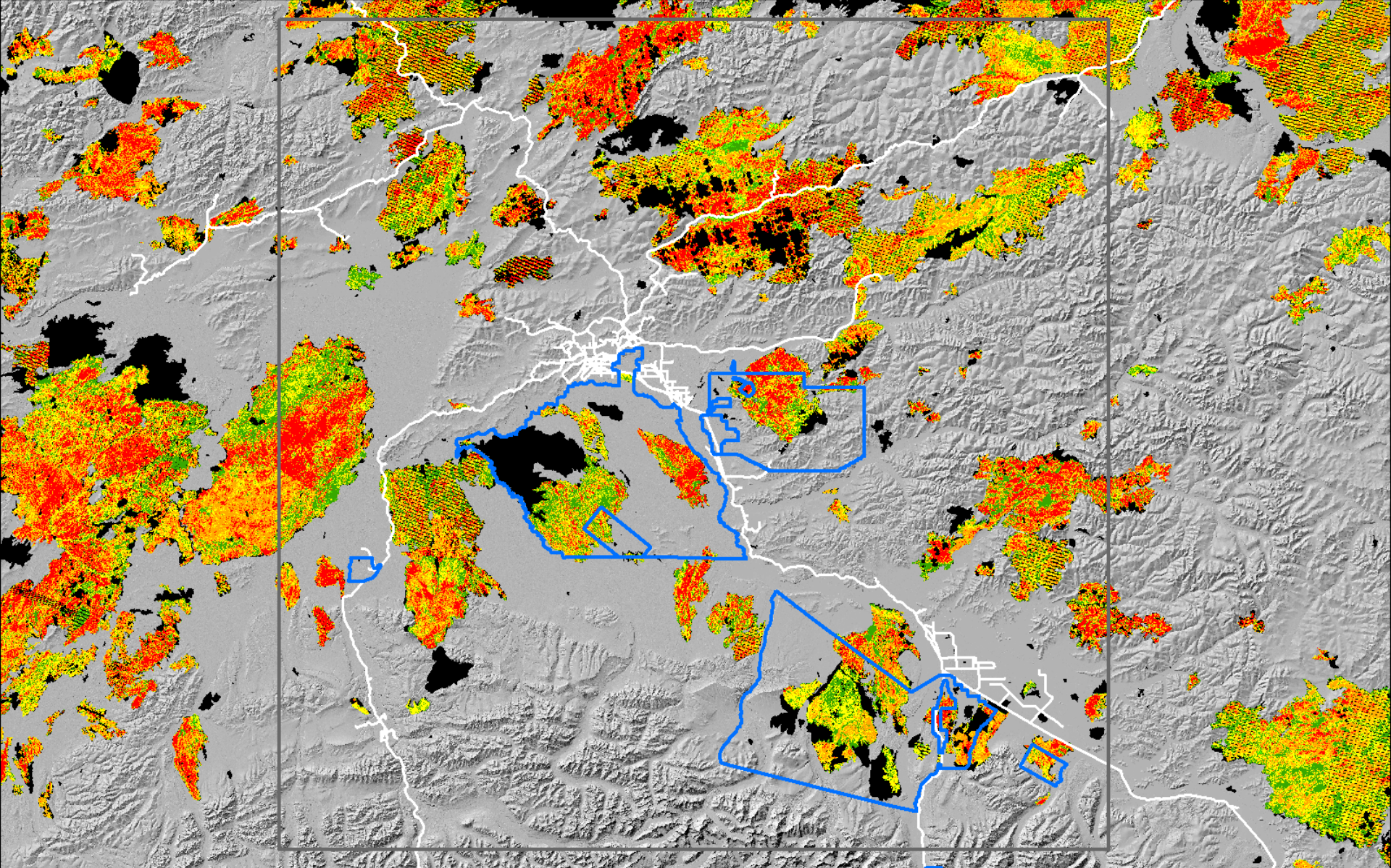
- *Overarching goal*: Map the trajectories of post-fire vegetation recovery & composition change related to burn severity
- *Image data*: Long-term NDVI from Landsat (30 m) & MODIS (250 m) supplemented with very high resolution (2-3m) imagery
- *Field data* calibration / validation: Canopy composition, cover, density, height (*in situ* and UAV); depth of burning
- *Approach*:
 - Seasonal phenology time series to derive leaf habit (deciduous, evergreen).
 - Multi-year time series to map pre- and post-fire composition changes and trajectories



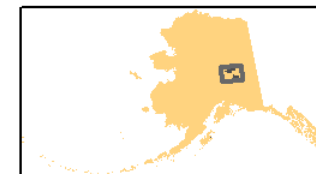
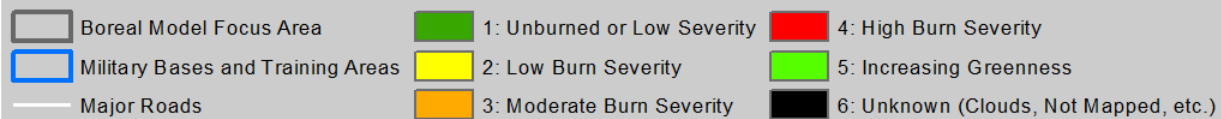
Fire History, 1940–2018 (Most Recent Fire Year)



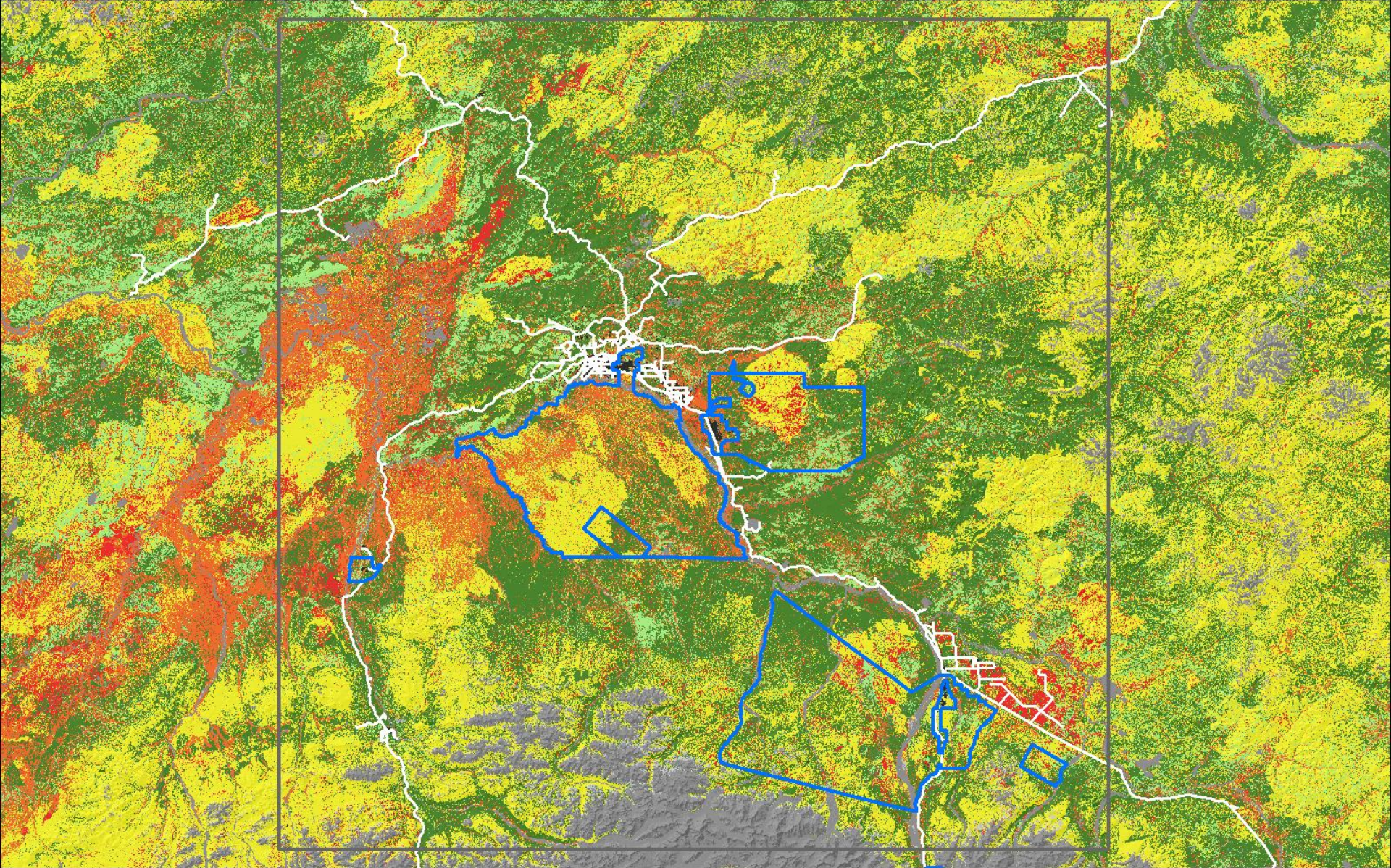
10
Miles



Fire History and Severity, 1984–2018

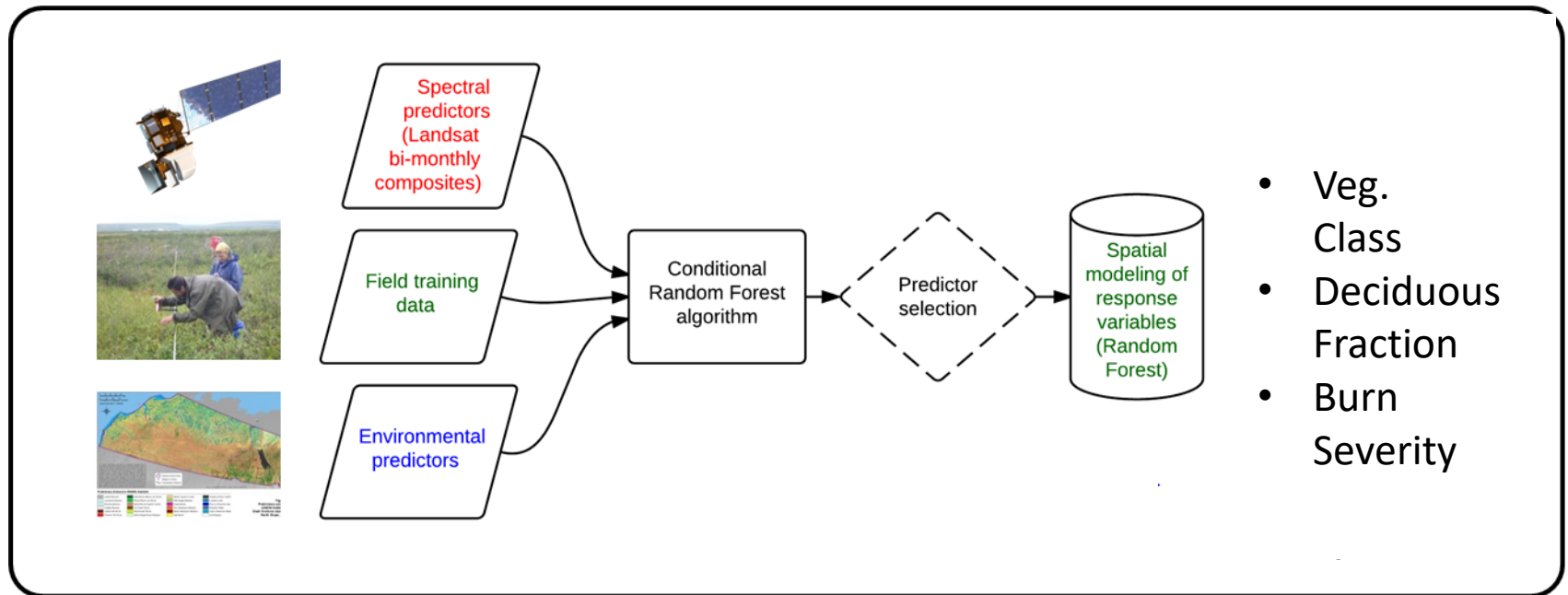


10
Miles

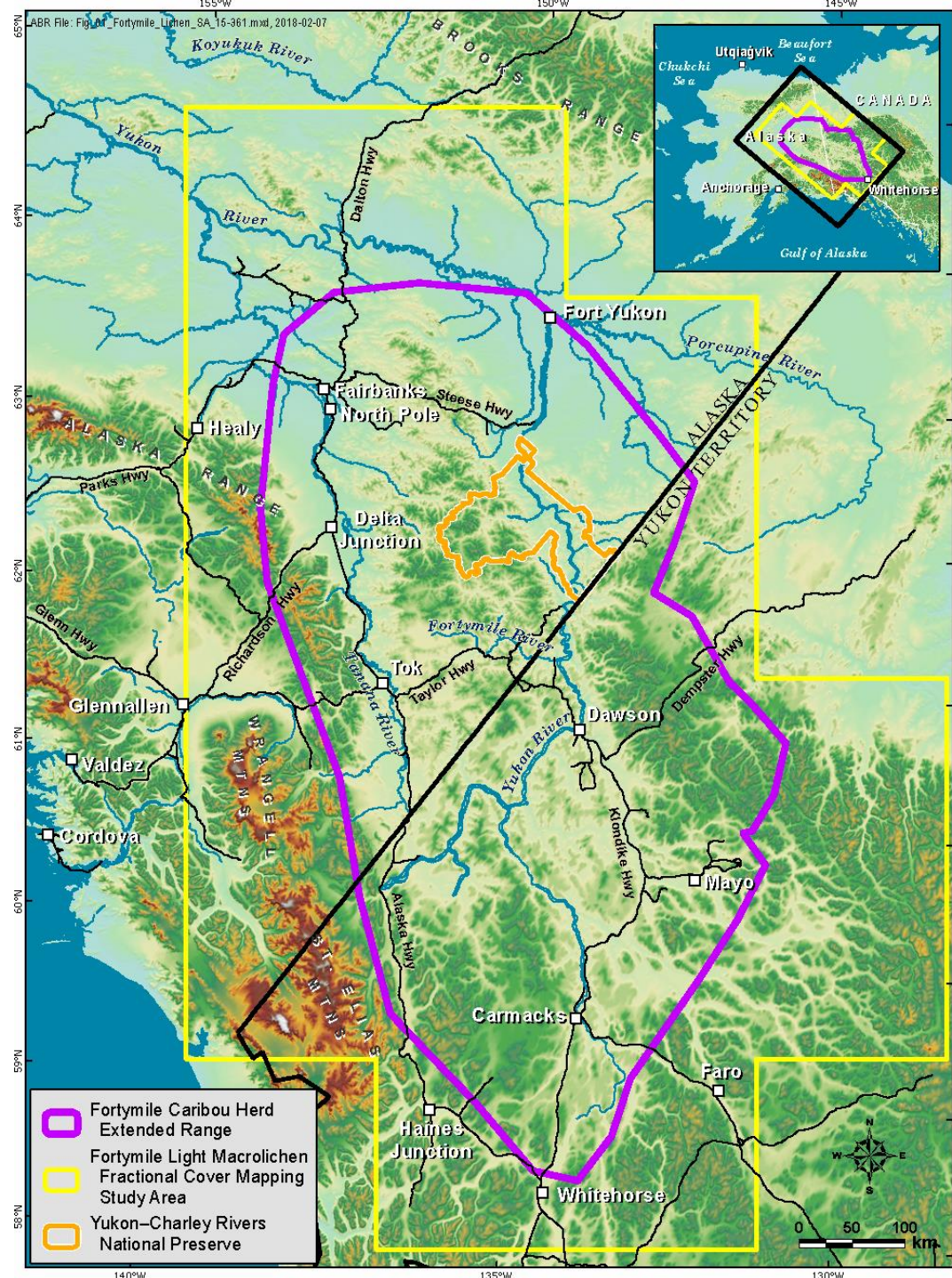


10
Miles

Machine Learning Models (Random Forest)

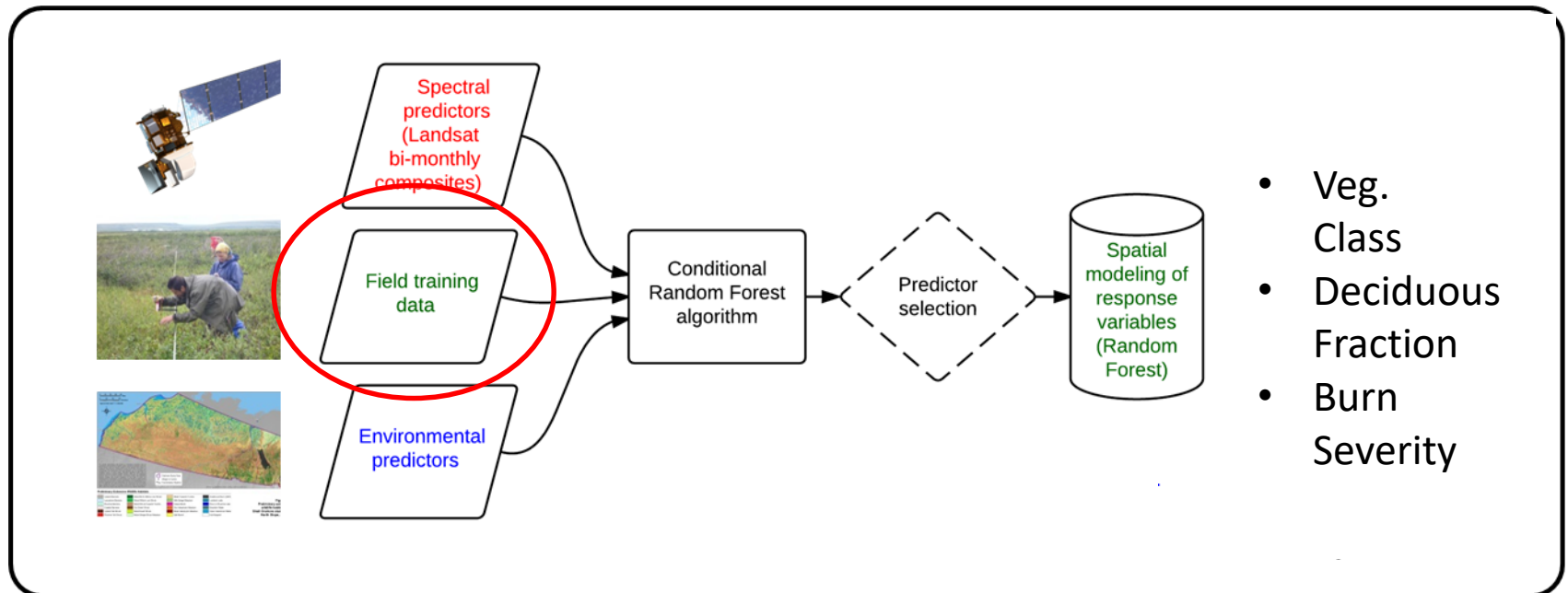


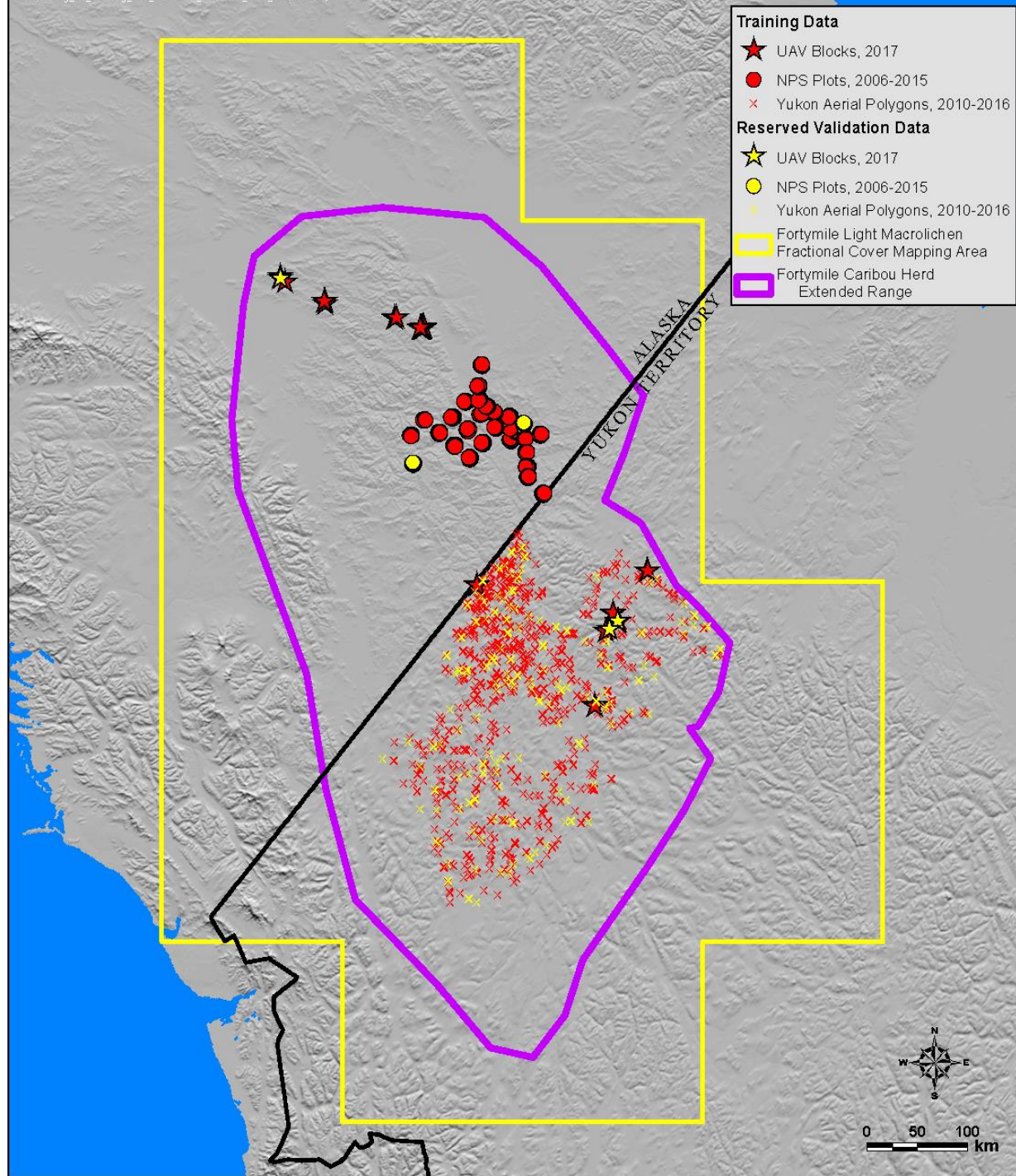
Fortymile Forage Lichen Mapping Example



Machine Learning Models (Random Forest)

Fortymile Forage Lichen Mapping Example





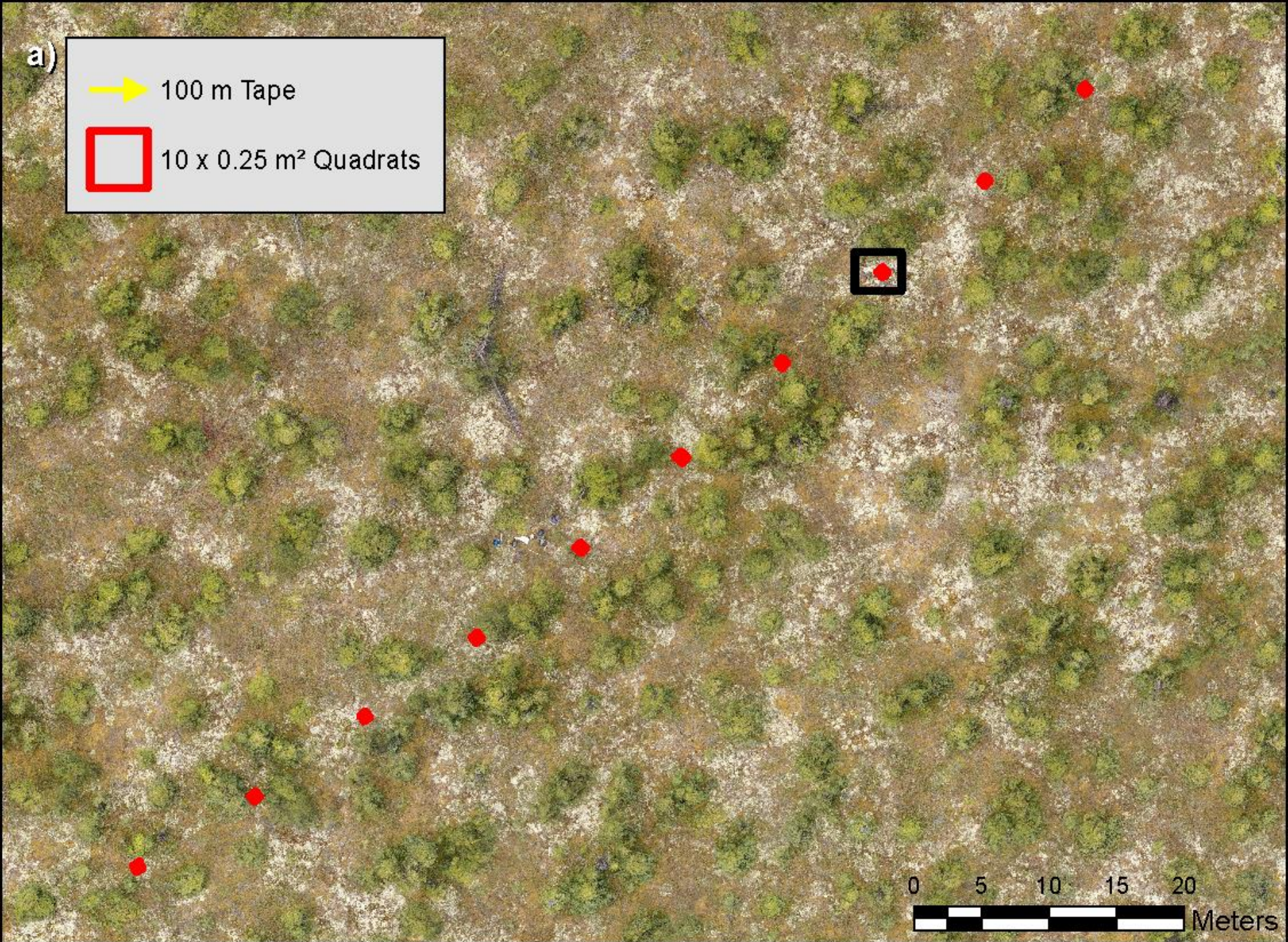
a)



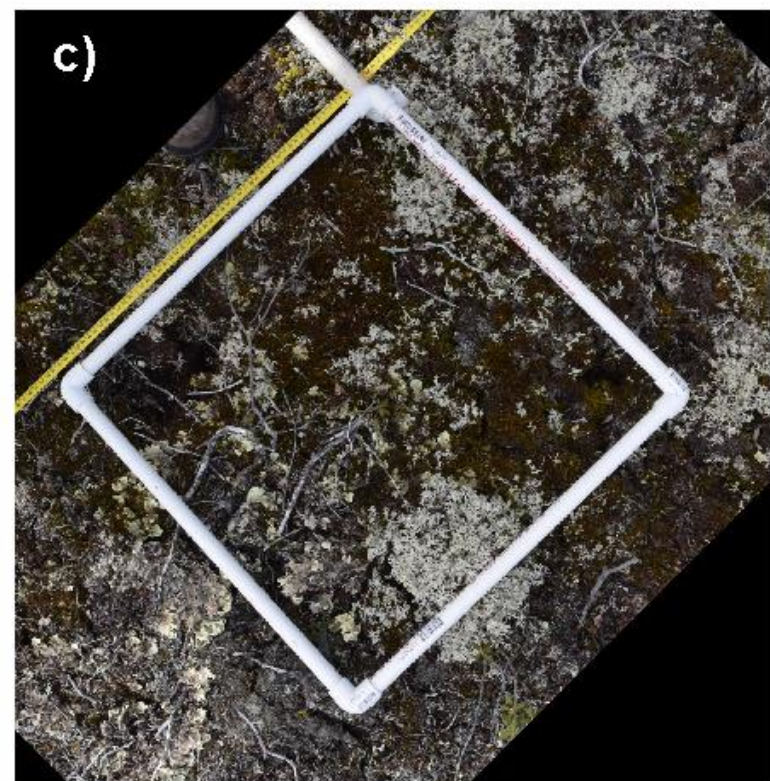
100 m Tape



10 x 0.25 m² Quadrats



0 5 10 15 20 Meters

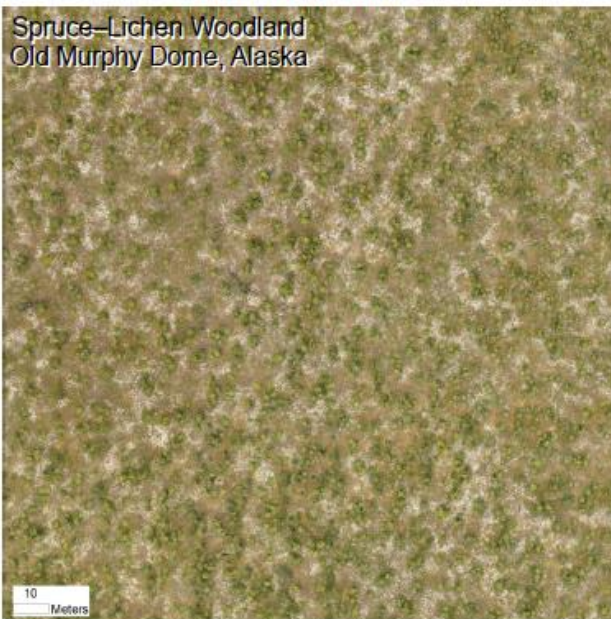


ABR File: Fig_04_UAV_Plot_Layout_2017_15-361.mxd, 2018-02-05

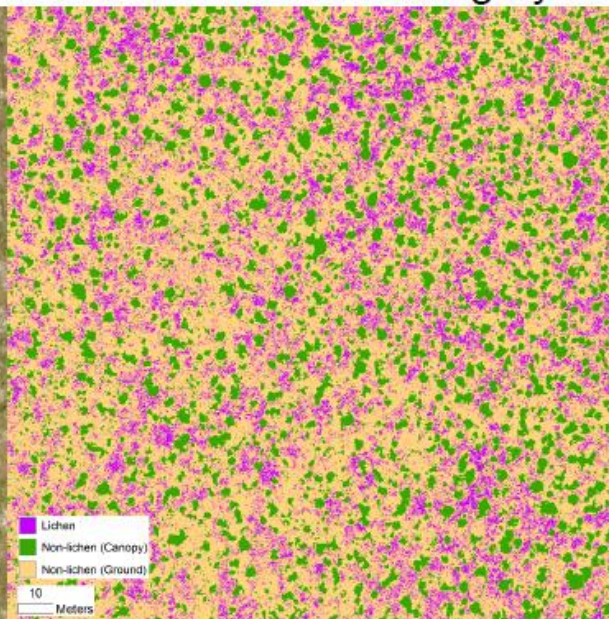
Figure 4. Layout of Unmanned Aerial Vehicle (UAV) lichen cover field plots, Alaska and Yukon Territory, 2017. a) Tape and quadrat layout at plot OMD_41_2017. Background imagery is 0.8 cm resolution color orthomosaic acquired with a UAV on 1 June 2017. b) Inset zoom of quadrat at 20 m along the tape. c) Vertical ground photo of the same quadrat acquired with a handheld camera.

Orthomosaic

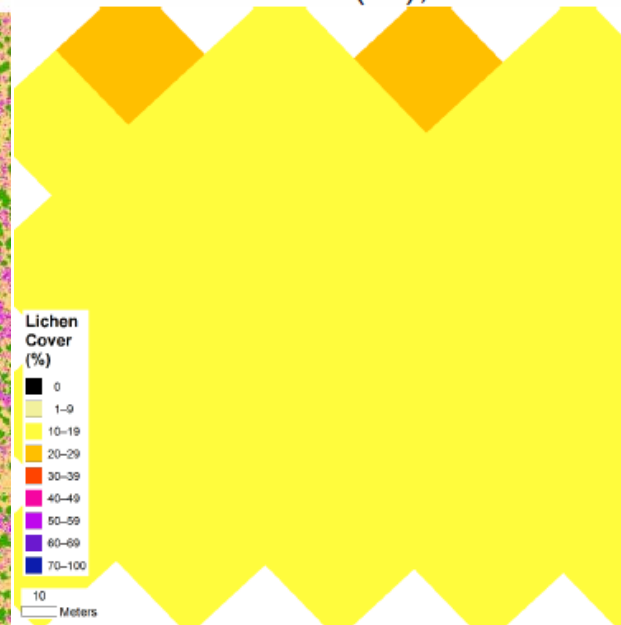
Spruce-Lichen Woodland
Old Murphy Dome, Alaska



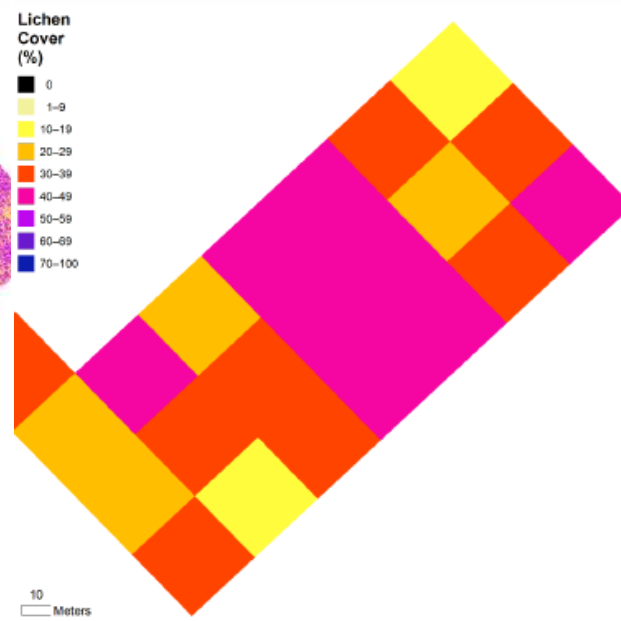
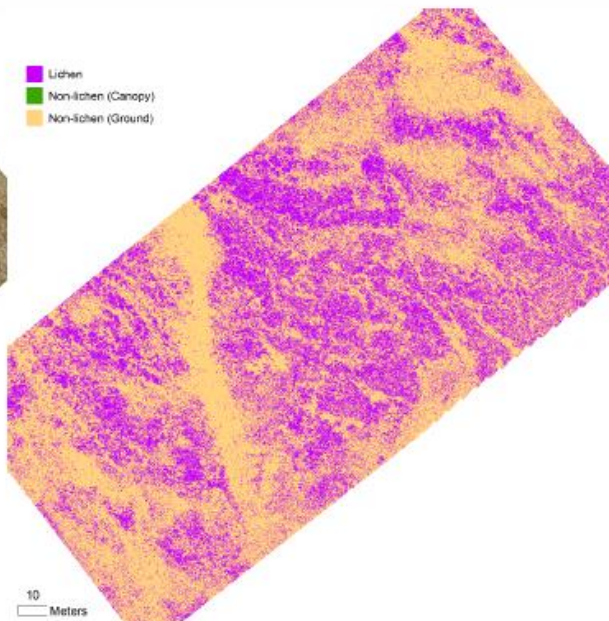
Classified UAV Imagery



Lichen Cover (%), 30 m

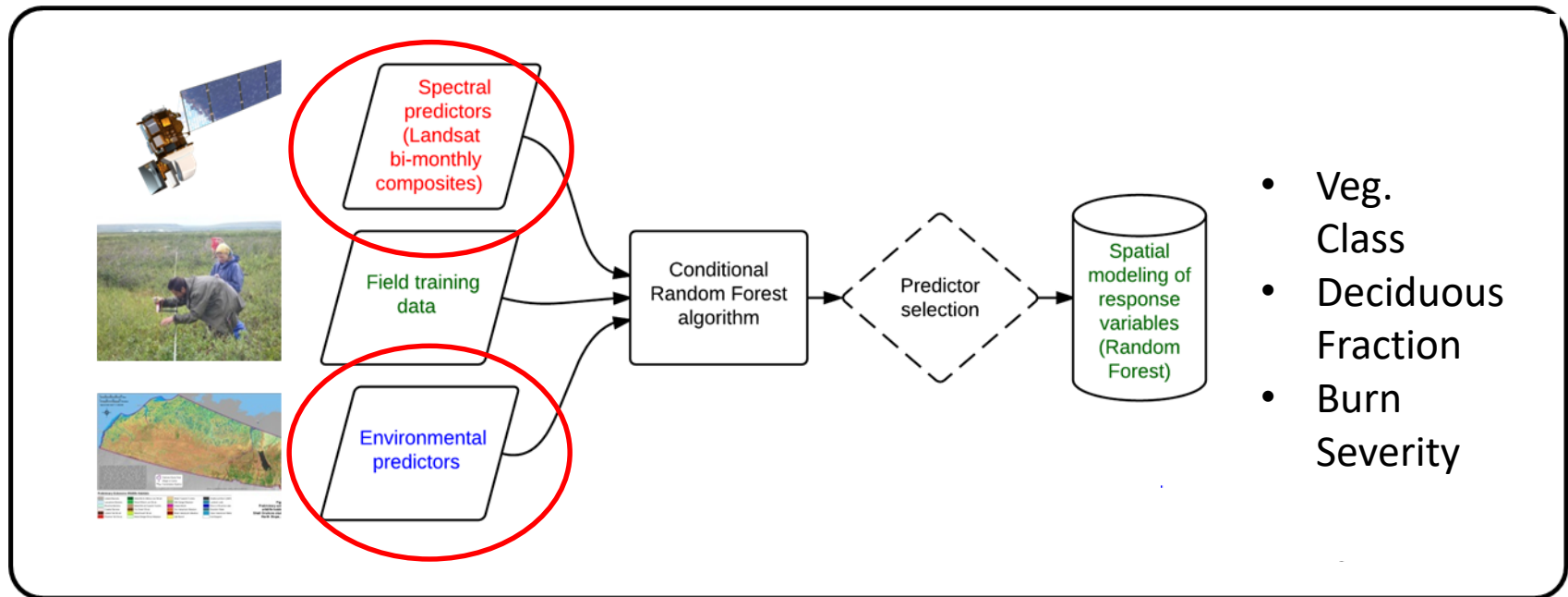


Alpine Tundra
Eagle Summit, Alaska



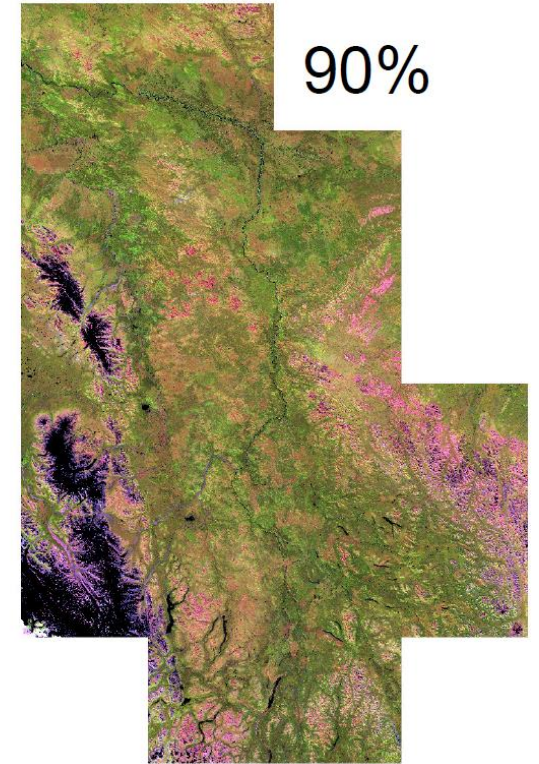
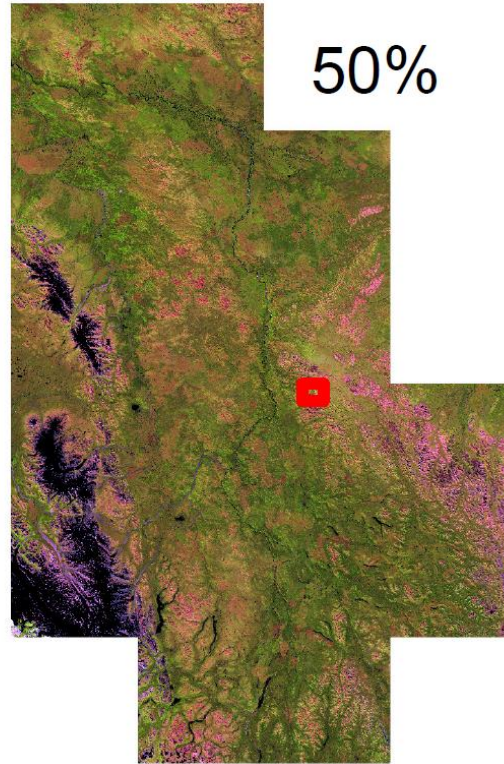
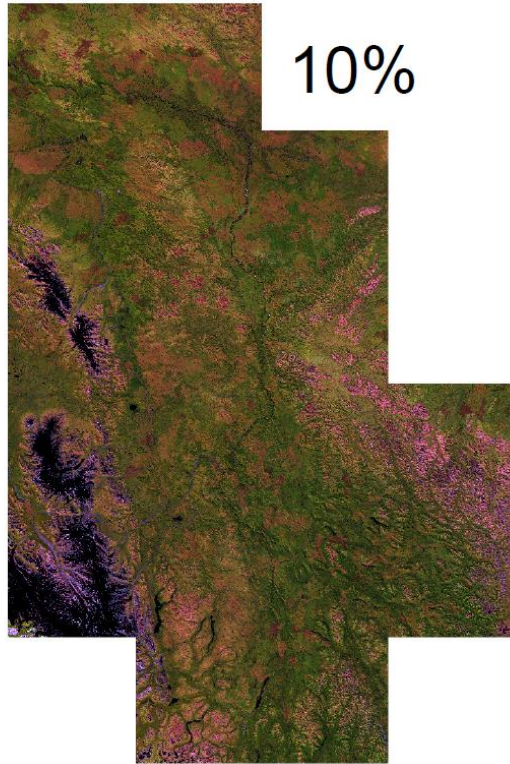
Machine Learning Models (Random Forest)

Fortymile Forage Lichen Mapping Example

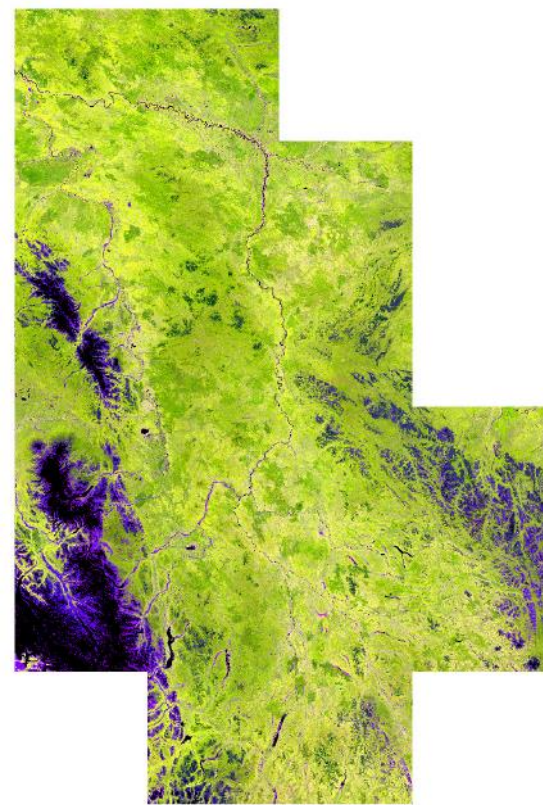


Spectral predictors: Landsat percentile composites (Fortymile Forage Lichen Example)

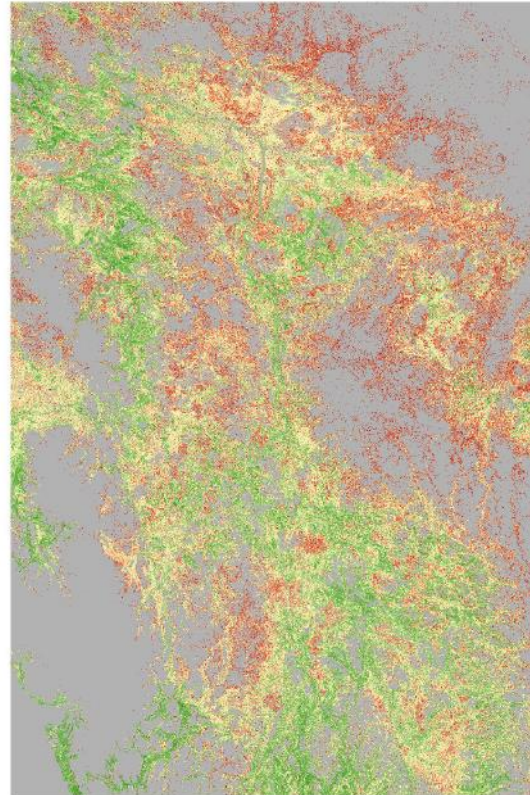
Raw Surface Reflectance Percentile Composites, May–September, 2014–2017



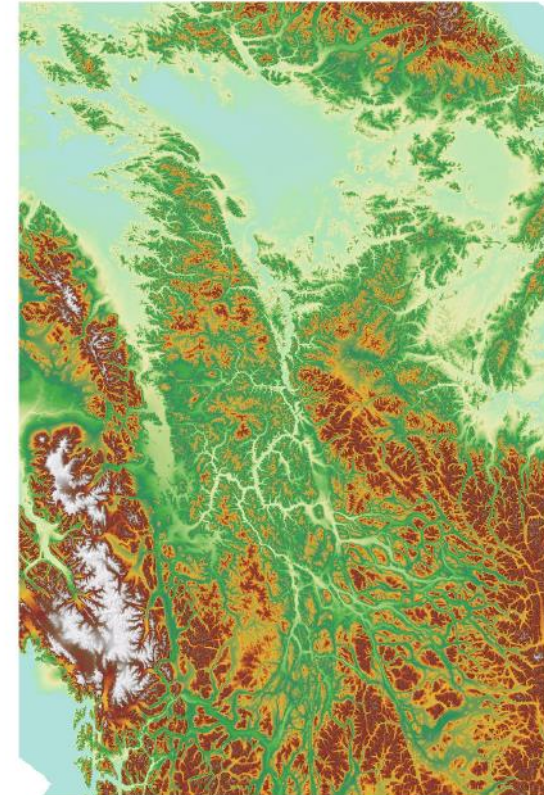
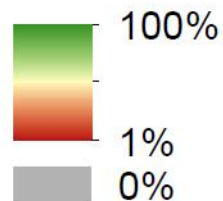
Additional Spectral and Environmental Predictors



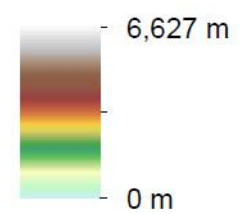
NDMI/NDVI/
NDSI (50%)



Tree Cover, 2016
(Hansen 2013)

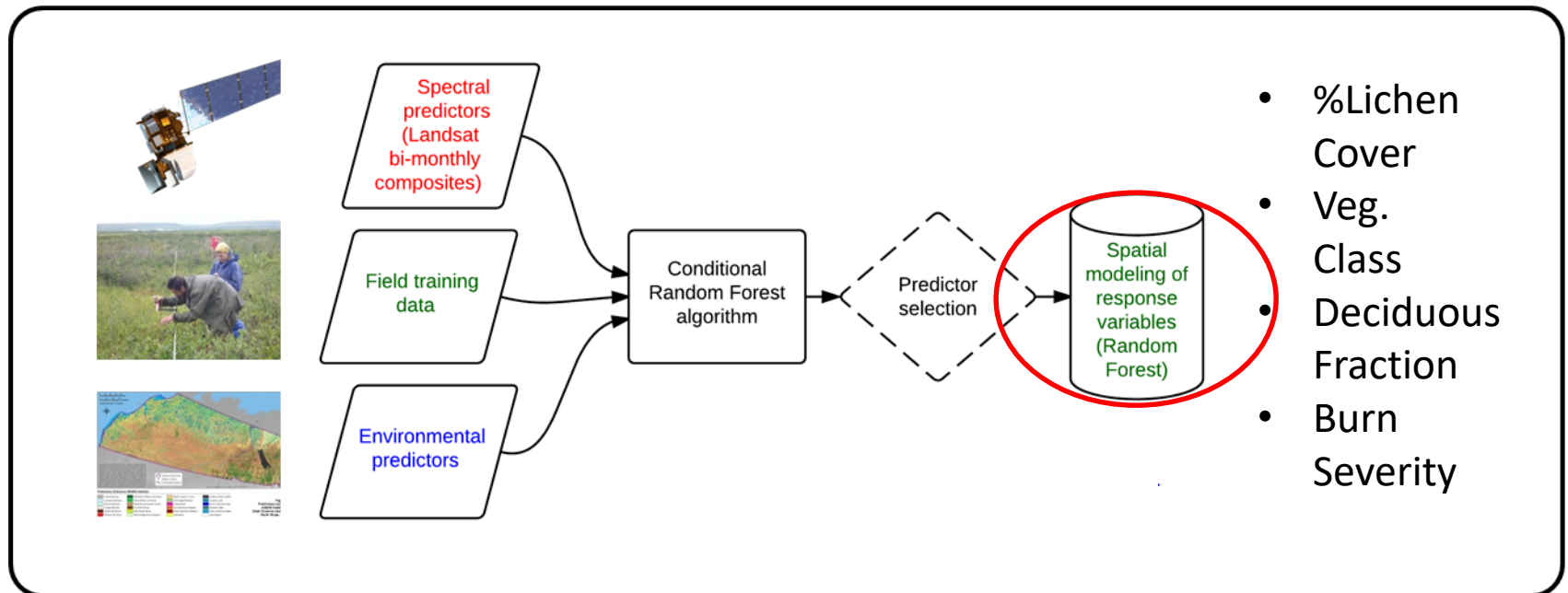


Elevation
(m)

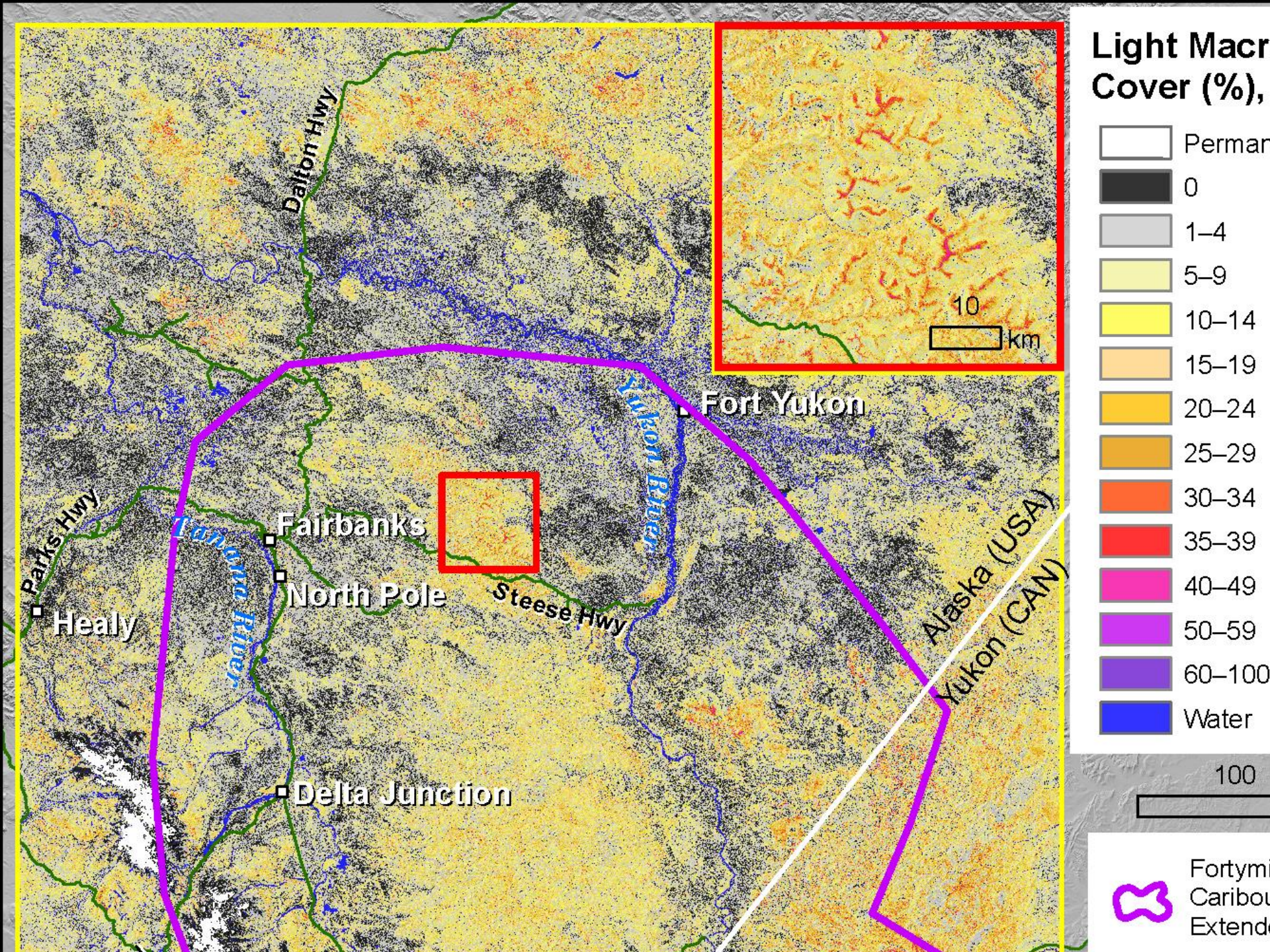
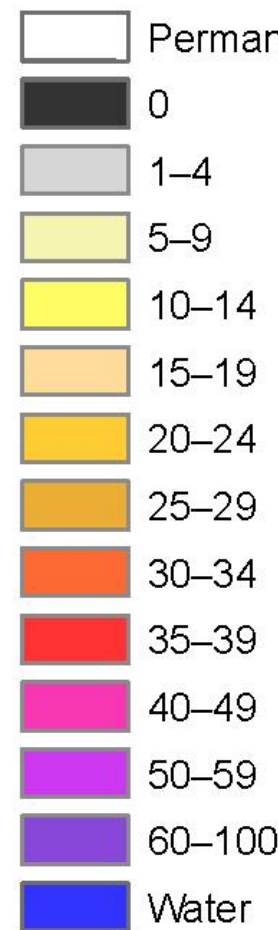


Machine Learning Models (Random Forest)

Fortymile Forage Lichen Mapping Example



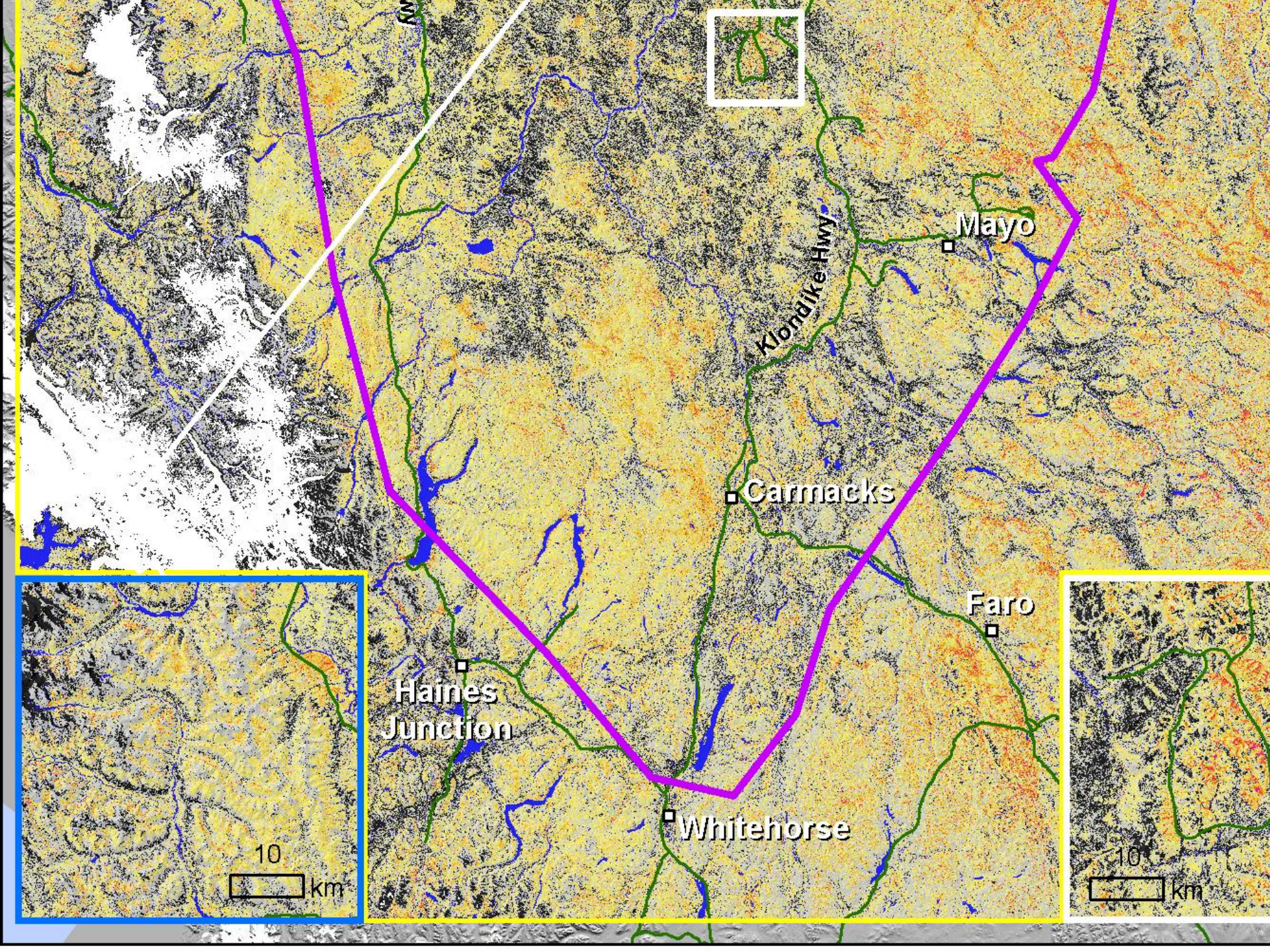
Light Macro Cover (%),



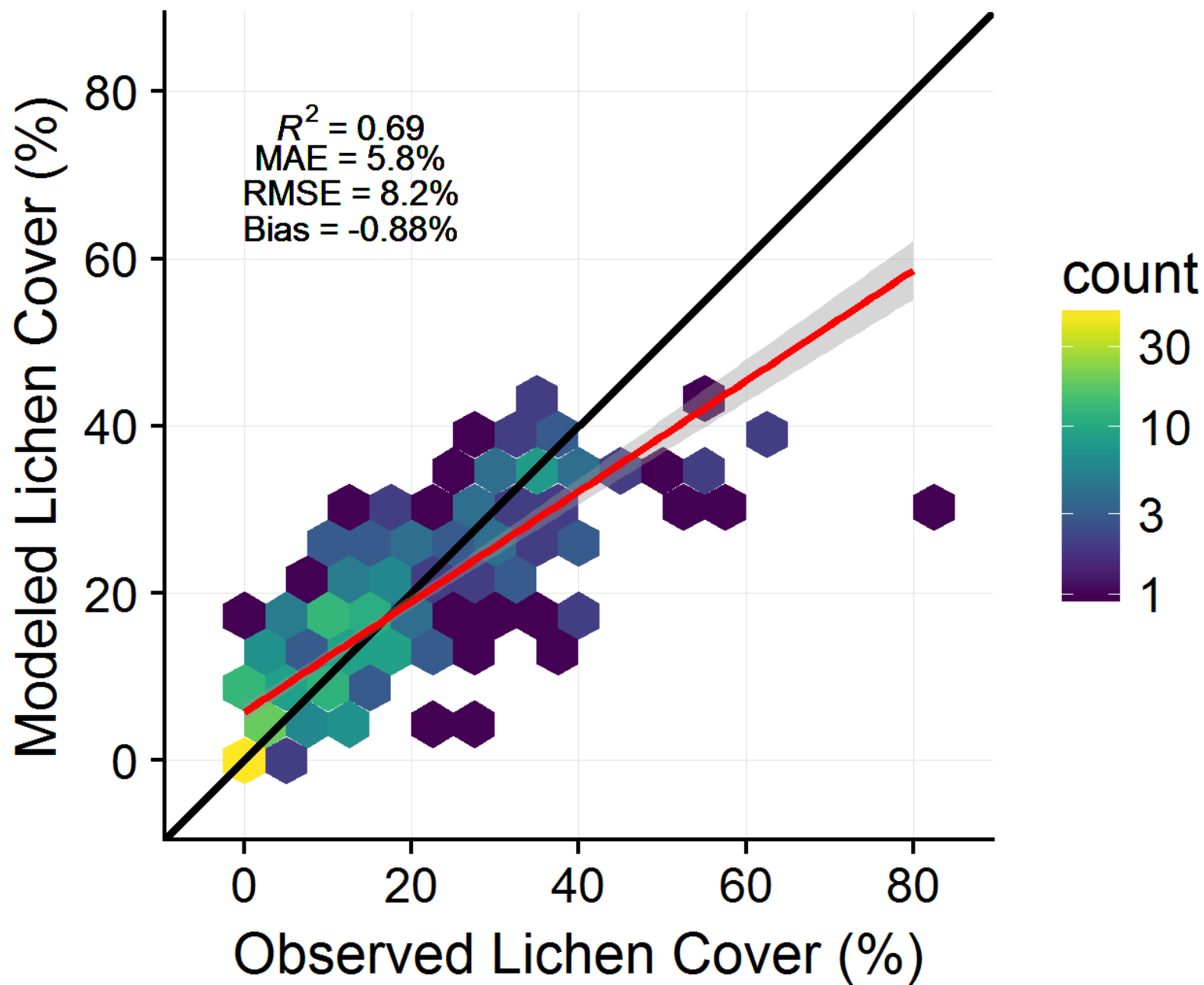
100

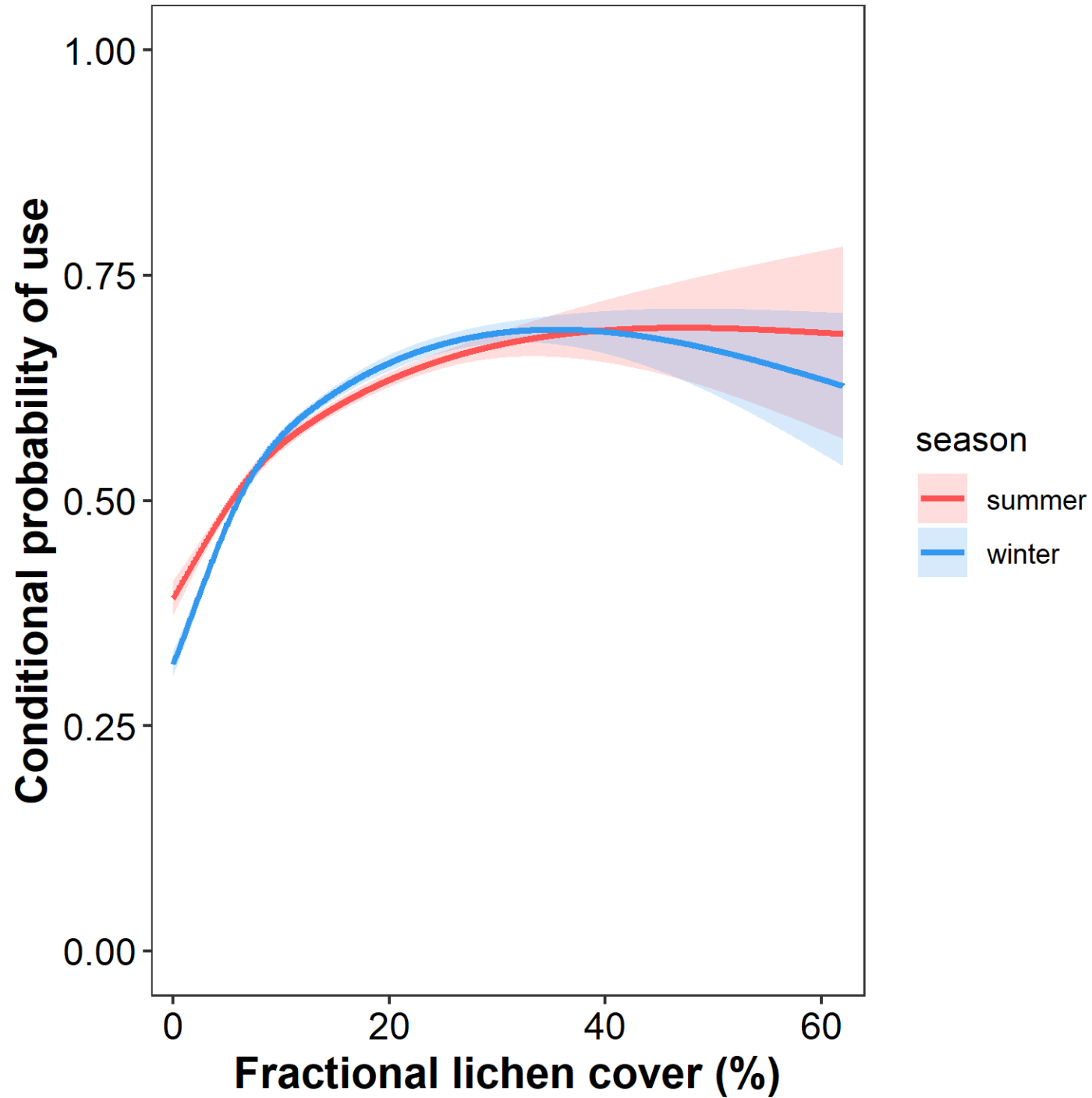


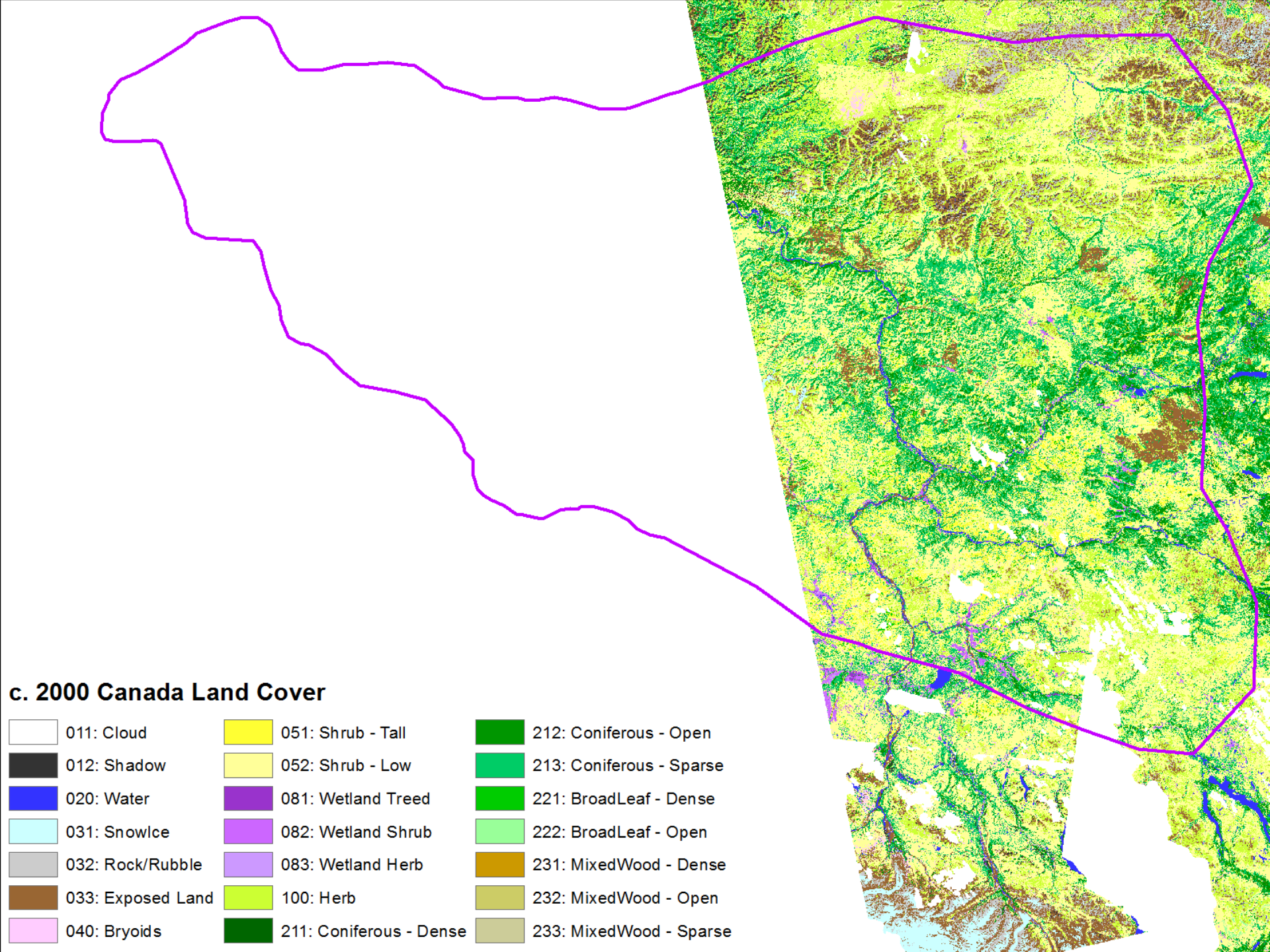
Fortymile
Caribou
Extensive



Reserved Validation Data

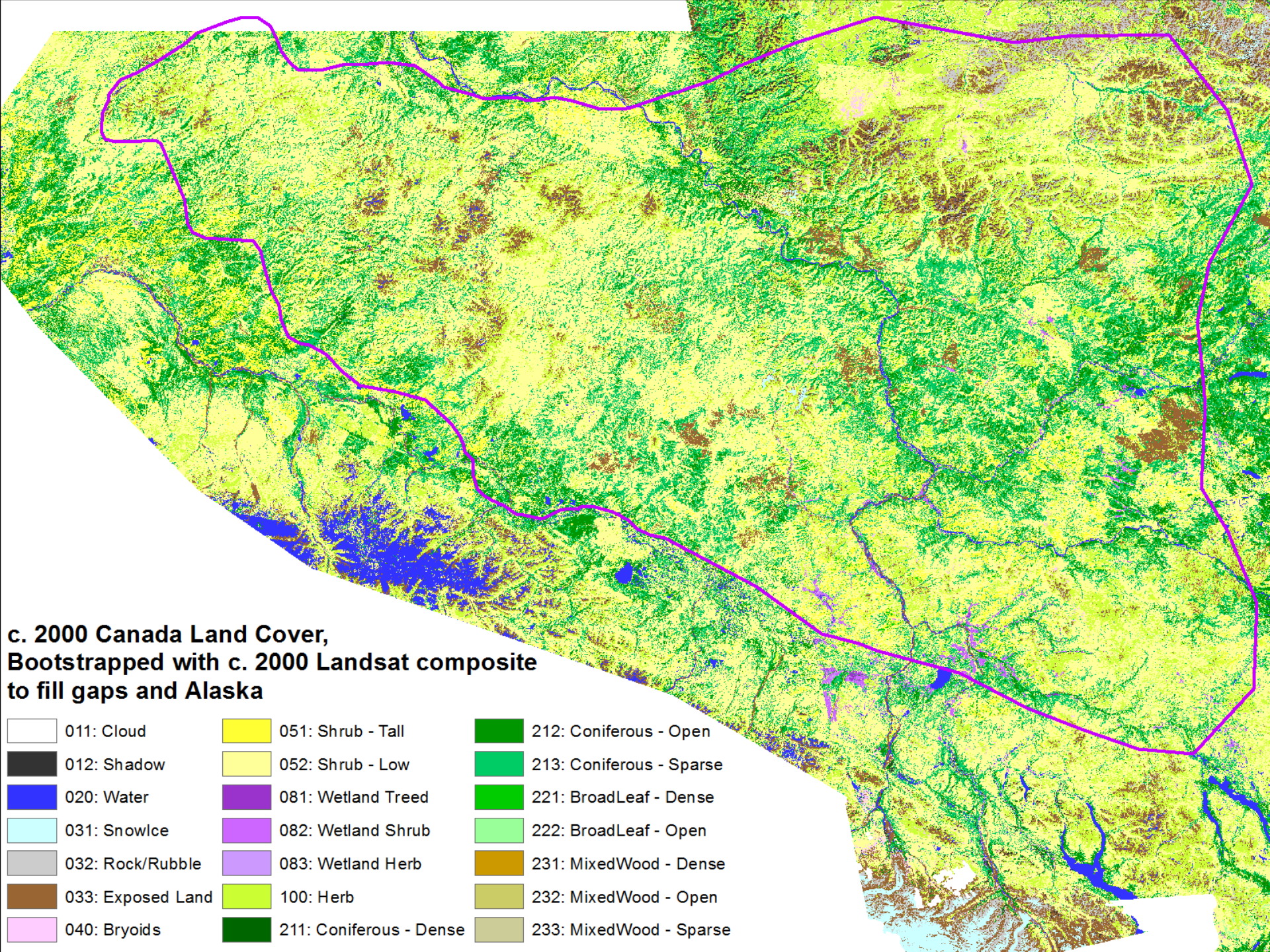




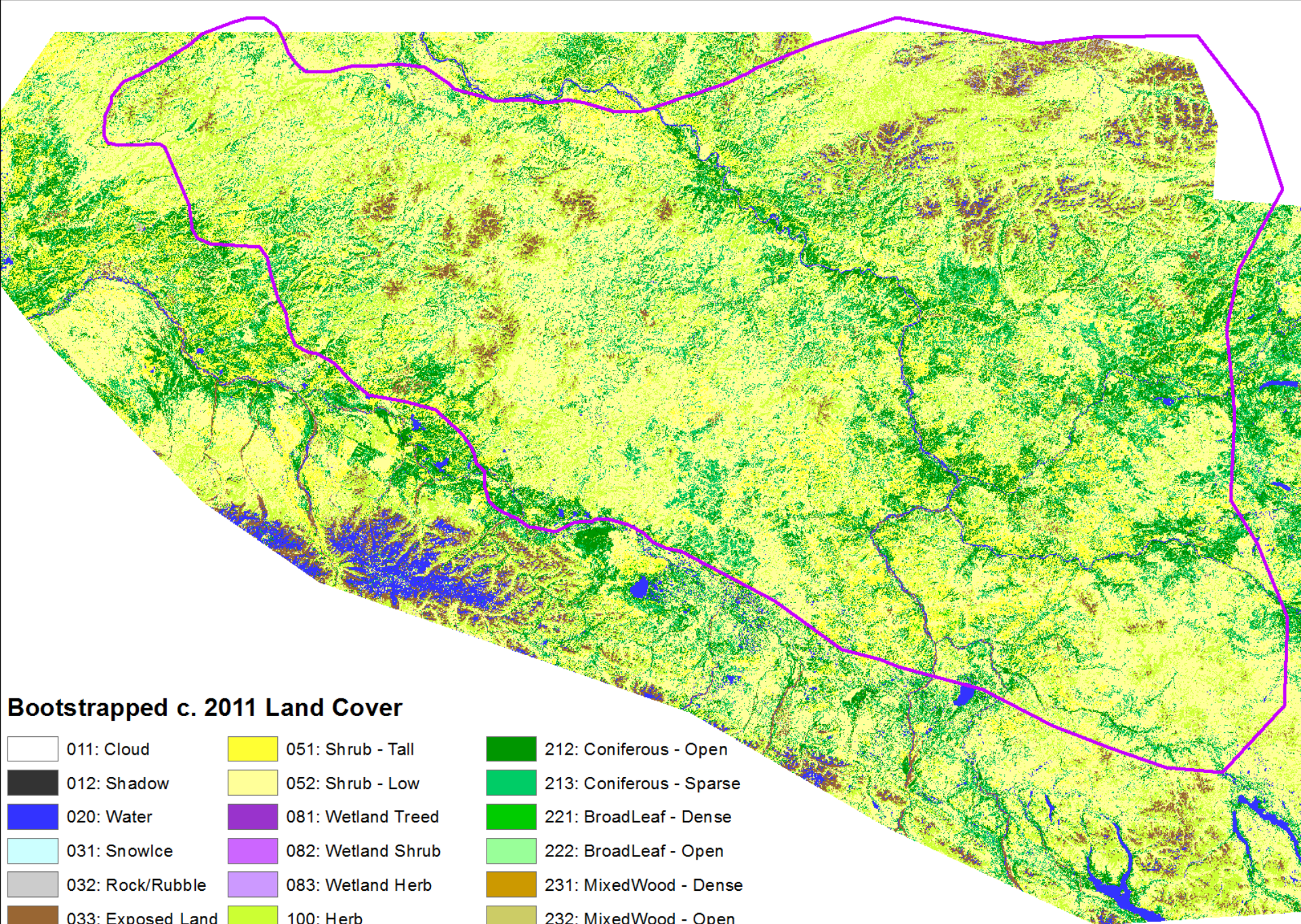


c. 2000 Canada Land Cover

011: Cloud	051: Shrub - Tall	212: Coniferous - Open
012: Shadow	052: Shrub - Low	213: Coniferous - Sparse
020: Water	081: Wetland Treed	221: BroadLeaf - Dense
031: Snow/ice	082: Wetland Shrub	222: BroadLeaf - Open
032: Rock/Rubble	083: Wetland Herb	231: MixedWood - Dense
033: Exposed Land	100: Herb	232: MixedWood - Open
040: Bryoids	211: Coniferous - Dense	233: MixedWood - Sparse



011: Cloud	051: Shrub - Tall	212: Coniferous - Open
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Bootstrapped c. 2011 Land Cover

011: Cloud	051: Shrub - Tall	212: Coniferous - Open
012: Shadow	052: Shrub - Low	213: Coniferous - Sparse
020: Water	081: Wetland Treed	221: BroadLeaf - Dense
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033: Exposed Land	100: Herb	232: MixedWood - Open
040: Bryoids	211: Coniferous - Dense	233: MixedWood - Sparse



2018-07-24

50
Meters

Spruce Seedlings



2018-05-16

Mature Spruce

50

Meters

2018-05-16

50

Meters

2018-07-24

50

Meters

Animation of 2018 Controlled Burn

Thank You

For more information:

Matt Macander

Senior Scientist

ABR, Inc.—Environmental Research & Services

Fairbanks, AK

(o) 907-455-6777 x112

(c) 907-347-7041